An integrative view of foveated rendering

Bipul Mohanto, ABM Tariqul Islam, Enrico Gobbetti, Oliver Staadt

 PII:
 S0097-8493(21)00221-1

 DOI:
 https://doi.org/10.1016/j.cag.2021.10.010

 Reference:
 CAG 3443

To appear in: Computers & Graphics

Received date : 21 July 2021 Revised date : 13 October 2021 Accepted date : 14 October 2021



Please cite this article as: B. Mohanto, A.T. Islam, E. Gobbetti et al., An integrative view of foveated rendering. *Computers & Graphics* (2021), doi: https://doi.org/10.1016/j.cag.2021.10.010.

This is a PDF file of an article that has undergone enhancements after acceptance, such as the addition of a cover page and metadata, and formatting for readability, but it is not yet the definitive version of record. This version will undergo additional copyediting, typesetting and review before it is published in its final form, but we are providing this version to give early visibility of the article. Please note that, during the production process, errors may be discovered which could affect the content, and all legal disclaimers that apply to the journal pertain.

© 2021 Publishing services by Elsevier Ltd.

# **Title Page**

## Title: An integrative view of foveated rendering

Autor list and affiliations:

### **Bipul Mohanto**

Institute for Visual and Analytic Computing University of Rostock, Germany <u>bipul.mohanto@uni-rostock.de</u>

## ABM Tariqul Islam

Institute for Visual and Analytic Computing University of Rostock, Germany a.islam@uni-rostock.de

### Enrico Gobbetti Visual and Data-intensive Computing CRS4, Italy gobbetti@crs4.it

Oliver Staadt Institute for Visual and Analytic Computing University of Rostock, Germany <u>oliver.staadt@uni-rostock.de</u> Computers & Graphics (2021)



Contents lists available at ScienceDirect

Computers & Graphics

journal homepage: www.elsevier.com/locate/cag



### An integrative view of foreated rendering

Authors omitted for blind reviewing

### ARTICLE INFO

Article history: Received October 5, 2021

Keywords:

Foveated rendering. Gazecontingent rendering, Adaptive resolution, Geometric simplifi-Shading simplification, cation. Chromatic degradation, Spatiotemporal deterioration

### ABSTRACT

Foveated rendering adapts the image synthesis process to the user's gaze. By exploiting the human visual system's limitations, in particular in terms of reduced acuity in peripheral vision, it strives to deliver high-quality visual experiences at very reduced computational, storage, and transmission costs. Despite the very substantial progress made in the past decades, the solution landscape is still fragmented, and several research problems remain open. In this work, we present an up-to-date integrative view of the domain from the point of view of the rendering methods employed, discussing general characteristics, commonalities, differences, advantages, and limitations. We cover, in particular, techniques based on adaptive resolution, geometric simplification, shading simplification, chromatic degradation, as well spatio-temporal deterioration. Next, we review the main areas where foreated rendering is already in use today. We finally point out relevant research issues and analyze research trends.

© 2021 Elsevier B.V. All rights reserved.

28

29

30

#### 1. Introduction 1

Over the past decade, both the display resolution and 2 pixel density have rapidly increased in response to the de-3 mands of a variety of application setups, including immer-4 sive virtual reality (VR), augmented reality (AR), mixed 5 reality (MR), and large high-resolution displays (LHRD). 6 Despite the impressive improvements witnessed in the past, current displays are still far from matching human capabilities, and growth in pixel counts and density is still continuing. For instance, the densest commercial near-10 eye displays can offer an angular resolution on an aver-11 age of 10-15 cycles per degree, with exceptions such as 12 Varjo VR-3 achieving angular resolution of 35 cycles per 13 degree [213, 45], while humans can perceive over 60 cy-14 cles per degree in the fovea centralis [200, 169]. Moreover, 15 current displays are also viewing-angle restricted, e.g., on 16 average VR displays are limited to a field-of-view (FOV) 17 of  $0^{\circ}$  $0^{\circ}$  [45] whereas a human can perceive a much 18 wider range (see Sec. 3.2). Moreover, while some com-19 mercial displays have appeared that significantly increase 20 FOVs (e.g., StarVR reaches a 210° horizontal FOV), sup-21

porting wide FOVs together with high resolution is an open 22 research problem [251]. Specific setups, like stereoscopic or 23 light field displays, further increase the needed pixel count. 24

Interactive and immersive applications must also meet 25 the important constraints on refresh rates imposed by the 26 human perceptual system. Nowadays, 90 Hz has been es-27 tablished as a standard VR frame rate, while interactive 120 Hz [88]. Nevertheless, gaming monitors maintain according to Cuervo et al. [50], the refresh rate may need to be increased up to 1800 Hz for life-like VR immersion. 31

The need to generate a large number of pixels at very 32 high frequencies is only partially matched by the concur-33 rent increase in the performance of graphics hardware. 34 First of all, the hardware capabilities are typically ex-35 ploited to improve the visual realism of rendered images, 36 by increasing scene complexity or rendering quality. Many 37 data sets, including large simulation data [104], CAD mod-38 els [257], or production-quality 3D scene descriptions [212] 39 are often exceedingly large and costly to render in even 40 the simplest modality. Moreover, while global illumina-41 tion algorithms, such as ray tracing and path tracing have 42

 $\mathbf{2}$ Preprint Submitted for review / Computers & Graphics (2021) frequency of publication 0 0 0 2007 2008 2009 2010 2012 095 2014 2012,2016 of har \*200°200° 201) 2013 (9<sup>9</sup>) . ngî og cog og

Fig. 1. The chart is depicting the outstanding foveated rendering research included in this survey report. The novel techniques described different peripheral degradation techniques. The latest papers are still unpublished in 2021 during writing this survey.

been significantly accelerated in the recent years by the 1 emergence of programmable GPUs with general-purpose 2 programming capabilities and dedicated raytracing cores, 3 real-time photorealistic image synthesis remains extremely Δ difficult on current graphics platforms because of the in-5 trinsic complexity of accurately computing light propaga-6 tion in complex and possibly dynamic environments. Scaling to remote rendering systems is only a very partial solu-8 tion since video transmission matching human visual field 9 and frequency constraints consumes over 100 Gbps [22], 10 which is infeasible over the current network standard. 11

As a result, generating high-quality interactive experi-12 ences remains an elusive target that we cannot expect to 13 solve in the foreseeable future by hardware performance 14 15 improvement alone. For this reason, the last decades have seen a flourishing of methods that strive to improve ren-16 dering performance in time and resource-constrained set-17 tings [257, 6]. The underlying idea of all these techniques 18 is to exploit various characteristics of our visual system 19 to present approximate images that can be computed or 20 transmitted with the available resources and timing con-21 straints while being perceived identical, or marginally dif-22 ferent, to the high-quality target. 23

In particular, on displays that uniformly cover a reason-24 ably large FOV, much of the visual information is wasted 25 due to the space-variant nature of human vision, which 26 has high resolution only in a small central region. In 27 fact, due to the highest cone density, the color and visual 28 detail perception are higher in a smaller retinal region, 29 the fovea [106, 38, 80]. Aside from the fovea, vision in 30 the periphery quickly diminishes. As a result, in current 31 VR setups, only 4% of the pixels are visible at a fixa-32 tion [106, 173]. Likewise, Wei et al. [238] report foveated 33 region covers roughly 8% of the whole  $0^{\circ}$  of a desktop 34 monitor. 35

Developing specialized image synthesis methods that exploit the human visual system's limitations, in particular in terms of reduced acuity in peripheral vision, to deliver high-quality visual experiences at very reduced computational, storage, and transmission costs is thus a potentially very effective approach. Techniques to achieve this goal have been introduced in the past under the name of "foveated rendering" [80, 173], "gaze-contingent rendering" [61, 56, 34, 60, 163, 151, 218, 203, 204, 9, 26, 239, 114] or, in more general context, "perception driven rendering" [164, 27]. However, "foveated rendering" is more prevalent in the literature. Thereby, in this survey, we will stick to this terminology. Over the years, many foveated rendering techniques have been introduced to optimize rendering fidelity, frame rate, compression, transmission, and power consumption (Fig. 1). In this context, the fundamental tasks are the identification of the user's gaze and the exploitation of this knowledge to perform the optimization. Many variations have been proposed, with vertical solutions dependent on specific gaze tracking, displays, or rendering algorithms.

42

43

44

45

46

47

48

49

50

51

52

53

54

55

56

In the recent past, several surveys have been presented 57 in foveated rendering research (Sec. 2). However, these 58 studies were mainly limited to particular display technolo-59 gies (mostly VR), applications, as well as on perceptual 60 issues. On the other hand, our survey provides an up-to-61 date integrative view of foreated rendering, investigating 62 the entire research spectrum from the point of view of the 63 rendering methods employed, showing their commonalities, 64 differences, and specialization to specific setups. Compres-65 sion and transmission are covered as they form an enabling 66 technology for distributed rendering. The target audience 67 of our survey includes computer graphics researchers and 68 practitioners in relevant application fields. Researchers 69 will find a structured overview of the field, which organizes 70 the various problems and existing solutions, classifies the 71 existing literature, and indicates challenging open prob-72 lems. Practitioners and domain experts will, in turn, find 73 a presentation of the areas where foveated rendering has 74 already been applied in practice, as well as an analysis of 75 applications and settings that still pose major challenges. 76

After summarizing the related survey literature (Sec. 2), we present an overview of relevant properties of the human visual system (HVS) and explain the different terminologies required to comprehend the foveated rendering (Sec. 3). Following that, we provide an abstract characterization of the techniques that can be applied for foveated section (Sec. 3).



Fig. 2. A visual index of this survey.

rendering, introducing our proposed classification (Sec. 4). 1 The various solutions proposed in the literature, their fun-2 damental elements, key problems, as well as promising po-3 tential research directions are then analyzed according to 4 our classification (Sec. 5 - 8). We then provide an overview 5 of the main applications in which foreated rendering has 6 been applied (Sec. 9). We finally discuss the identified research issues and research trends (Sec. 10) and conclude with a general summary of the findings of this study 9 (Sec. 11). A visual index of this survey is depicted in 10 Fig. 2. 11

#### 2. Related surveys 12

The study of foveation effects has a very long history. 13 Early applications were mostly in psychophysical research, 14 with experiments centered around studying the effects of 15 stimuli presented when the participant's gaze is fixated 16 upon a predefined location. Such a concept was first pro-17 posed by Aubert and Foerster in 1857 [15]. Later, in 18 1973, Stephen Reader [185] was among the first to de-19 velop computerized gaze-contingent imagery. Following, 20 the gathered knowledge was exploited in a variety of ap-21 plications, giving birth to the foveated rendering research 22 area. Extensive surveys on different facets of foveated 23 rendering have been conducted over time, such as eve-24 tracking [180, 190, 107, 191, 33, 119], latency require-25 ments [8, 218, 135, 221], foveated display classification 26 [102, 202, 61, 171], gaze-contingent rendering [229], pe-27 ripheral vision [206], peripheral limitations [83], periph-28 eral degradation effect [235], peripheral visual artifacts 29 [97], graphics quality constraints [40], foreated path trac-30 ing [118], foveated VR and AR optics [45, 95]. However, 31 an up-to-date overall characterization and study of the 32 graphics techniques employed for optimization purposes 33 are missing. 34

In an eye-tracking and interaction survey, Duchowski et al. [215] propose a taxonomy for gaze-based interaction applications in which foreated rendering has been described as a *passive interaction* that manipulates the screen content in response to eye movement. The taxonomy further is classified into *model* and *image-based* rendering. The model-based approaches pre-manipulate graphics geometry before even the rendering process starts, e.g., number of triangles reduction. In contrast, the image-based approaches reduce spatiotemporal complexity of pixel data just before rendering with convolution filter, e.g., Laplace [34], Gaussian [223, 42, 140], and Kalman filter [96]. Noteworthy, the Gaussian filter is widely used as it is more compatible with the human visual system [42]. This taxonomy has been well adopted in several other studies [57, 58]. Furthermore, Hunter et al. [163] combine both image and model-based rendering as a hybrid approach which 51 is more appropriate for GPU implementation on modern hardware. In another survey on gaze-contingent display, Duchowski et al. [61] classify screen-based foreated rendering into focus plus context and screen-based displays. Spjuit et al. [102, 202] provide a classification of displays along two axes. The first one characterizes a display according to how angular resolution varies as a function of eccentricity. The second axis, addresses how a system adapts to changes in user gaze direction. As each of these axes is divided in four categories (from none to full), a total of 16 display categories are identified.

Among the most relevant surveys, Swafford et al. [210] 63 investigate four foveated rendering methods: peripheral 64 resolution, variable per-pixel depth buffer samples for 65 screen-space ambient occlusion (SSAO), GPU-level tessel-66 lation for the fovea, and variable-per-pixel ray casting mea-67 sures throughout the field of view. Weier et al. [244] con-68 cisely surveyed foreated rendering in the context of the 69 more general field of "perception-driven rendering". In 70

35

36

37

38

39

40

41

42

43

44

45

46

47

48

49

50

52

53

54

55

56

57

58

59

60

61

Preprint Submitted for review / Computers & Graphics (2021)

this survey, foveated rendering has been classified into two 1 classes: with and without an active gaze tracker, and fur-2 ther divided into scene simplification and adaptive sam-3 pling. The work has been further extended in Martin 4 Weier's Ph.D. thesis [239], which extends the previous 5 state-of-the-art report [244] discussing pre-filtering, sam-6 pling adaptation, temporal coherence, and post-filtering aspects of current perception-driven methods. Our work 8 focuses exclusively on foveated graphics and provides a 9 deeper coverage of this field. Most recently, Matthews et 10 al. [150] published a brief report on a few seminal foveated 11 rendering research, with existing research challenges and 12 future research directions. Noteworthy, most of these sur-13 veys are strictly limited to VR displays. 14

In contrast to previous studies, our survey does not target a particular display technology or application. This review aims to investigate the entire foveated rendering research spectrum, focusing on characterizing the classes of optimization methods employed and showing their specializations to different settings, from near-eye displays to large high-resolution displays and application domains.

### 22 3. Background

Foveated rendering, similarly to other approximate rendering techniques, aims to optimize various aspects of the rendering process by exploiting the peculiar characteristics of the human visual system. In this section, we provide relevant background information to create a common ground for concepts and conventions used in the rest of the paper.

#### 29 3.1. Human eye and vision

The human visual system (HVS) is a complex biological 30 system that contains 70% of all photoreceptors and four 31 billion neurons. Almost half of the primary visual cortex 32 is engaged in vision [48] in which 25% is devoted to pro-33 cessing data from central visual angle ° [101]. The 34 eye works as a vision sensor that allows light rays to pass 35 to the retina through an adjustable iris, being refracted by 36 the cornea and a crystalline lens using six different muscle 37 movements [45, 244]. The retina consists of three types 38 of photoreceptors: rods, cones, and retinal ganglion cells, 39 which convert the light signal into an electrical signal. The 40 optical nerves work as information bus which transmit vi-41 sual signals from the retina to the visual cortex with an 42 estimated bandwidth of 10 Mbps [22]. The rods are highly 43 light-sensitive and even can be activated by a single pho-44 ton. Cones are, on the other hand, less light-sensitive but 45 pass color and detailed visual cues to the visual cortex for 46 further processing. 47

There are approximately 120 million rods, six million cones, and 24-60 thousand photosensitive retinal ganglion cells [43]. Noteworthy, these numbers may vary in different studies, e.g., Kaplanyan et al. [106] suggest 4.6 million cones. The cones have a high density around the center of the optical axis known as the fovea; around 1.50 mm in diameter [198]. Different studies have revealed dis-54 tinct foveal angles in between  $^{\circ}$ ° around the opti-55 cal axis [80, 156, 173]. The HVS processes the highest 56 acuity of contrast, color, and depth information in the 57 fovea [26]. The neighboring regions in a circle of up to 58  $^{\circ}$  is called parafovea, and up to  $^{\circ}$  perifovea. Exceed-59 ing that begins the peripheral region [190, 121], which can 60 be further classified as near, mid, and far peripheral (see 61 Fig. 3) [16]. Most foreated rendering solutions differentiate among the central foveal region, where most of the 63 rendering effort is concentrated, and the rest of the field-64 of-views [80, 156, 173]. 65



Fig. 3. The foveal angle varies between studies. However, most studies mention from  $\pm$  ° to  $\pm$ . ° around the optical axis [80, 156, 173]. Neighboring regions in a circle of size of ° is called parafovea, and up to ° perifovea. Exceeding that begins the peripheral region [190, 121], which can be further classified into near (until  $\pm$  0° around the optical axis), mid (from  $\pm$  0° to  $\pm$  0°), and far (from  $\pm$  0° to  $\pm$  0°) periphery [16]. Human vision roughly spans  $\pm$  0 ° horizontally around the gaze direction when the head is stable [11]

#### 3.2. Field of view

68

69

70

71

72

73

74

75

76

77

The human vision spans roughly  $0^{\circ}$  ° [11]; however, this measure with a steady focus of the eyes. The stereoscopic vision is composed of two monocular visions, which the brain stitches together. Each eye has roughly

° monoscopic field of view (FOV), and ° overlap region [80]. Nonetheless, with head rotation, humans can see almost  $0^{\circ}$   $0^{\circ}$  horizontal arc. However, physically, humans can roughly observe only around  $0^{\circ}$ in as little as 0 second during saccades and can follow moving objects at speed up to  $0^{\circ}$  [50]. Under a neareye VR display, the immersion consistently begins from

0° FOV and steadily grows up with higher angle [118] whereas higher eccentricity raises the risk of motion sickness. Furthermore, there is an existing research challenge between FOV and angular resolution. The increment of FOV lowers the angular resolution which may easily perceivable by the viewers.

56

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

100

#### <sup>1</sup> 3.3. Eye movement estimation

The eye movements, such as saccades, smooth pursuit, vergence and accommodation, and vestibulo-ocular movements directly affect human perception [142]. The saccades are the rapid ballistic eye motions that suddenly dis-5 rupt intervals of fixation and lead the fovea to the scene's region of interest (ROI), and lasts 10-100 ms exceeding  $00^{\circ}$ [53, 181, 142, 150]. Perceptual changes during brief saccades are barely detectable by humans [187]. Smooth pursuit is active during eyes track a moving object with 10 detectable velocity. Vergence and accommodation refer 11 to the eye's fixation process, in which the ciliary muscles 12 change the crystalline lens's refractive potential to reduce 13 the volume of a blur for the fixated depth of the scene 14 [89]. Vestibulo-ocular movement occurs while the eye is 15 locked on an ROI, but the head moves. For more details 16 about eye movements, see [181]. However, eyes only cap-17 ture visual stimuli during *fixations* that stand 200-400 ms. 18 During this phase, the eyes stay stationary in the ROI. 19 The fixation follows two oculomotor functions: rotation of 20 the eyes as such the ROI falls on the two eyes' fovea, and 21 then optimize the crystalline lens adjustment so that the 22 retinal images become sharp [121]. Moreover, the image 23 needs to be updated within 5 ms of fixation; otherwise, 24 the observer may detect the low-resolution image due to 25 foveated degradation [134, 38]. 26

### 27 3.4. Eye tracking

Eye-tracking is a technique that detects user's eyes 28 and calculates where or what they are looking at. The 29 point where the user is looking is referred to as the *gaze* 30 *point*. Modern eye trackers mainly rely on an infrared light 31 source and video cameras to track black pupil circles and 32 the white corneal glint, which is a projection of infrared 33 rays from the outer surface of the cornea. During eye 34 movement, the pupil follows the gaze direction, while the 35 corneal reflection remains unaffected. The camera-based 36 eye tracking systems can be categorized as near-eye vs. 37 remote, on-axis vs. off-axis, model vs. regression-based, 38 single vs. multi-camera input (see [110]). Duchowski et 39 al. [215] classify gaze tracking into active, passive, single, 40 and multi-modal. Besides, the *accuracy* of eye trackers is 41 defined as the average distance between the real-stimuli 42 position and the measured gaze position [16, 142]. 43

#### 44 3.5. Latency requirement

The higher precision and lower latency are of utmost 45 importance for an optimized foveated rendering. Higher 46 latency increases discomfort (i.e., simulation sickness, fa-47 tigue), perceptional degradation visibility, and artifacts 48 [242]. The motion-to-photon (MTP) delay, a.k.a., end-to-49 end latency, consists of tracking latency and frame latency; 50 defined as the time between capturing an eye/gaze move-51 ment and the frame reflection associated with the display 52 change. The frame reflection is the duration between the 53 GPU and the display, is generally half of the MTP delay. 54 In modern graphics pipelines, 5 ms or less frame latency 55

for stereo VR and 16-33 ms for gaming PCs are achievable [105].

Guenter et al. [80] suggest that VR has an optimal latency of 23 ms or less, but 40 ms or more is a delayed latency. Similarly, Albert et al. [8] recommend 20-40 ms as the most suitable value for latency for VR, while 50-70 ms is somehow tolerable, and 80-150 ms or more is unacceptable. On the contrary, Stengel et al. [203] report, 50-91 ms is the tolerable threshold. Li et al. [129] strongly suggest, for foveated rendering, the MTP delay should be less than 50 ms. Likewise, Stengel et al. [204] recommend the latency should never exceed 60 ms. Arabadzhiyska et al. [14] report that HVS sensitivity is fully restored within 40-60 ms after the saccade ends. Therefore, the frame should be updated within that time frame. In contrast, other authors [38, 105] report that the image should be updated within 5 ms after a saccade to avoid artifacts. Romer et al. [189] also suggest, for  $0^{\circ}$  video streaming, the latency should be approximately 20 ms. Similarly, Koskela et al. [118] report the latency for immersive applications should be less than 20 ms, which is further supported by the experiment [116] that use 14 ms latency under VR. However, Patney et al. [173] use 20-37 ms tracking latency in addition to the frame latency in their experiment. The figure 4 shows an overview of MTP delay which has been observed in multiple studies for VR applications.

Besides the MTP delay, pixel-row-update adds a considerable amount of latency to the desktop monitor. In the early 1990s, the MTP delay of 100-150 ms was more common for volumetric visualization [127]. However, the recent progress of processing power can remarkably lower that latency. Thunström's [218] study suggests that up to 42 ms latency is tolerable for 95% of the subjective studies with desktop monitors, whereas Loschky et al. [135] report 60 ms should be the standard. To sum up, for immersion, the best MTP delay should be 5 ms, and on average 20 ms. Moreover, the MTP delay should never cross 50 ms regardless of display technologies. In addition, researchers have determined that the peripheral degradation at longer latencies (80-150 ms) must be reduced with respect to the amount considered acceptable at shorter latencies (50-70 ms), since the additional latency increases the likelihood of the viewer noticing visual artifacts in the peripheral area [135].

#### 3.6. Visual acuity

Visual acuity or clarity of vision is described either 101 as the Snellen value or Minimum Angle of Resolution 102 (MAR). The normal visual acuity is defined as 0 0 103 Snellen value, equivalent to 1 arc minute in MAR in the 104 fovea [204, 206, 85]. Current foveated rendering research 105 considers this normal visual acuity as a standard for dis-106 play design. However, since, in realty, average viewers can 107 barely achieve half of the maximum visual acuity, the most 108 readable visual contents are designed for visual acuity of 109 20/40. Spjut et al. [102] suggest that 0 0 visual acuity 110 should also be the standard for foveated rendered displays. 111 Preprint Submitted for review / Computers & Graphics (2021)



Fig. 4. Overview of Motion-to-photon (MTP) observed in different studies on VR applications. The studies are arranged from left to right from the smallest to the largest observed delay. In blue (5-20ms), we depict the best cases, in green the average case (around 40ms), and in red the worst cases (above 50ms). These thresholds are the average suggested thresholds indicated in the literature.

However, Behnam et al. [22] report that commercial VR displays at the time of their survey (2017) hardly provide

2

0 0 visual acuity. 3

Studies tried to establish a relation (see Equation 1) of visual acuity fall-off from the visual axis [80]:

0

(1)

Here,  $_0$ , e, and m denote the smallest resolvable angle in 4 cycle per degree (cpd), eccentricity in degrees, and slope 5 respectively. The MAR model has been shown to fit low-6 level vision task findings as well as anatomical characteristics of the retina. Inverting the visual acuity results in 8 the MAR as a linear model [245]. The minimum dis-9 cernible MAR increases linearly with eccentricity  $0^{\circ}$  $0^{\circ}$ 10 [203, 80, 243, 238]. However, according to few other stud-11 ies, e.g., [206, 36, 67] visual acuity is subject to hyperbolic 12 fall-off. 13

#### 3.7. Contrast sensitivity function (CSF) 14

Unlike visual acuity, contrast sensitivity (CS) characterizes different aspects of visual function. Clinical trials often do not include CS in addition to visual acuity tests. Contrast is a difference in luminance, typically the difference in reflected light levels between adjacent points. CS function (CSF), expressed in cpd units, refers to the number of samples that can be discerned at a particular distance from the foveation point. It is defined as the reciprocal of the minimum contrast threshold (CT) to perceive a sinusoid of spatial frequency f, at different eccentricities e [72, 198, 260] (see Equation 2):

Humans can perceive with a resolution of 60-65 cpd in the fovea [200, 169, 7], gratings as fine as 1 arc-minute per pixel [216, 8] or equivalent of 120 pixels per degree (ppd) [98]. Interestingly, Cuervo et al. [50] report that humans with corrected vision have better than normal vision and the visual acuity ranges between 0.3-1 arc-minute ( 60-200 ppd). However, clinically 30 cpd has been considered as standard [110, 247].

15

16

17

18

19

20

21

22

23

24

25

26

27

28

29

30

31

32

33

34

52

53

54

55

56

57

58

Researchers have different views about the visual sensitivity fall-off with eccentricity. Weier et al. [244] suggest acuity reduces by 75% at an eccentricity  $^{\circ}$ , whereas few studies recommend, after  $0^{\circ}$ , the sensitivity is reduced ten times [201, 143]. Similarly, Watson et al. [231] suggest that by  $0^{\circ}$  eccentricity, the human visual system can no longer resolve gratings narrower than 7.5 arc-minute per pixel. According to Aksit et al. [7], after °, the angular resolution drops to about 2.5 cpd, although Reddy et al. [184] recommend, the minimum visual acuity humans can perceive in the periphery is 8 cpd.

### 3.8. Adaptation effects

It is often reported that the HVS is sensitive to contrast 35 in luminance ranging from 0 (objects viewed 36 under illumination from the stars) to 0(objects 37 viewed on a bright sunny day) [186]. However, the instan-38 taneous dynamic range is much lower, as it is limited to 39 4 orders of magnitude, with lower luminance perceived as 40 noise, and higher luminance as over saturated uniform ar-41 eas [146]. This is because humans extend their dynamic 42 range by adapting to changes in the ambient luminance 43 by moving as detailed vision windows along the luminance 44 axis. Interestingly, adaptation is performed according to 45 the luminance perceived in an area covering about one degree around the gaze direction, which is, however, fre-47 quently changing, also because of saccades [86]. Since the 48 process of luminance adaptation is slower than gaze direc-49 tion changes, as noted by Mantiuk et al. [146], in most sit-50 uations the HVS is permanently in a maladaptation state. 51

#### 4. Overview and classification

As discussed in detail in Sec. 3, the fovea centralis captures finer details than those captured in the periphery. By exploiting this, foreated rendering techniques achieve optimization by nonuniformly distributing the rendering effort, in particular by lowering the rendering fidelity in noncentral areas.

Researchers have classified the foveated techniques in 59 different categories, e.g., experimental cognitive, algorith-60 mic, and hardware approach [90]. Regarding peripheral 61 degeneration, Watson et al. [233, 235] recommend geo-62 metric model, lighting-shading, texture, and window dif-63 ferent resolution. Accordingly, Swafford et al. [210] sug-64 gest four possible quality degradations in periphery: res-65 olution, screen-space ambient occlusion, tessellation, and 66 ray-casting steps. Similarly, Arabadzhiyska et al. [14] pro-67 pose spatial resolution, level of detail, and color can be 68

Preprint Submitted for review / Computers & Graphics (2021)



#### Fig. 5. The overall landscape of foveated rendering techniques (Sec. 5-8). The table focuses on methods, while applications are discussed distinctly in Sec. 9

. Each cited reference is assigned to the main class of technique. We further differentiate on whether it was originally applied for a static or dynamic gaze tracking and implemented for a ray tracing or ray casting pipeline.

reduced in the periphery. Wang et al. [229] report that geometry simplification, filter, and multi-resolution can be applied to the periphery; however, this study is limited to 3 video compression. 4

Our classification depicted in Figure 5 strives to seek 5 commonality among rendering approaches. The main differentiation is among the types of degradation that are performed (Sec. 4.1). For each of these main classes, we further differentiate on whether the technique was originally 9 proposed for a situation in which the gaze was assumed 10 static or dynamic (Sec. 4.2). Finally, we also differentiate 11 on whether the technique was originally implemented for 12 a ray-based or a raster-based pipeline (Sec. 4.3). 13

In the following, we first provide general information on 14 this classification. In the following sections, we will build 15 on our classification to provide an in-depth analysis of the 16 various methods that have been proposed in the literature. 17

#### 4.1. Main classes of peripheral degradation 18

From a rendering method point of view, the fundamen-19 tal differentiation is the type of adaptation that is per-20 formed. On this basis, we classify foveated rendering into 21

four groups, depending on the type of peripheral degradation that is performed:

- adaptive resolution techniques work mainly in image space to reduce image density in the periphery (Sec. 5); these techniques include general-purpose approaches, as well as techniques tightly bound to spe-27 cific display designs (called Hardware-oriented in this 28 survey);
- *geometric simplification* techniques work instead, in model space, by adapting the complexity of rendered 3D models contributing to different areas of the display (Sec. 6);
- shading simplification and chromatic degradation techniques reduce, by contrast, the work per pixel, simplifying the quality of illumination simulation or chromatic fidelity (Sec. 7);
- spatio-temporal deterioration, finally, improves perfor-38 mance by adapting the refresh rate of pixels across the 30 image, eventually reusing information from previous 40 frames for less important areas of the display (Sec. 8). 41

7

24 25 26

29

30

31

32

33

34

35

36

37

22

Preprint Submitted for review / Computers & Graphics (2021)

### 1 4.2. Static versus dynamic gaze point

Independently from the type of peripheral degradation 2 employed, foveated rendering assumes that there is knowl-3 edge of the gaze point, which determines how the effort 4 has to be distributed across the image. While the specific type of solution used for obtaining this knowledge 6 is not of primary importance for the rendering methods, 7 some differentiation may exist among techniques that as-8 sume a static gaze point (e.g., at the center of the display), q or techniques where the gaze point may dynamically vary 10 across frames (e.g., on the basis of eye-tracking or other 11 side information). For this reason, we distinguish between 12 methods using a static gaze point and methods using a 13 dynamic one. While we classify the presented techniques 14 based on the setting in which they were originally intro-15 duced, some of the static ones may adapt to dynamic set-16 tings, and vice-versa, with few adaptations. We will point 17 out these situations during the discussion. Nonetheless, 18 presenting this classification also provides a view of the 19 landscape of foveated rendering that shows the relative 20 importance, and the historical evolution of static and dy-21 namic setups. 22

Static foreated rendering schemes attempt to perform 23 perceptual optimization without any additional tracking 24 device. However, without gaze tracker, the typical as-25 sumption is that the user is looking at the center, and 26 that degradation might be applied at the periphery of the 27 image [183]. However, this is not a full-fledged technique, 28 as human vision simultaneously involves saccades and fix-29 ations of the scene. Nonetheless, static foreated rendering 30 techniques are still in widespread use, since they can be 31 applied in a wide range of situations. Commercial near-32 eye displays, e.g., Oculus Rift and StarVR, have adopted 33 this idea, sampling different regions with variable rates. It 34 should be noted that this variable-rate sampling is also im-35 portant to optimize rendering performance for these dis-36 plays, as it leads to throwaway peripheral pixels hardly 37 visible due to pincushion distortion. 38

On the other hand, more and more foveated rendering 39 schemes take into account a dynamic variation of gaze. 40 While methods relying on dynamic gaze variation can be 41 used without trackers, e.g., by assuming that the viewer is 42 following a particularly salient object, the large majority 43 of these schemes are developed in conjunction with some 44 tracking technology. Matthews et al. [150] differentiate eye 45 tracking from gaze tracking by stating that eye tracking 46 only measures eye movement, while gaze tracking tracks 47 the observer's head position to determine the actual gaze 48 point in the virtual world. In our work, we are not making 49 fine differentiations, as we are interested in how the gaze 50 position is exploited by optimized rendering algorithms. 51 For this reason, we cover a wide range of trackers, e.g., 52 position tracker, optical tracker, face tracker under the 53 gaze tracker umbrella term. 54

Depending on the purpose, the latest tracking hardware has either high accuracy and lower update frequency, or vice versa. Studies suggest that for optimizing foveated rendering, high frequency is more significant than high ac-58 curacy [16, 80]. Although few studies suggest that head 59 tracking is adequate for noncritical purposes, as the hu-60 man eye focuses closely on the head orientation ( $\pm$  ° ra-61 dius [20]), Lawrence et al. [64] report that, in VR applica-62 tions, inaccuracies and latencies may lead to motion sick-63 ness and nausea. For this reason, applications like immer-64 sion, cloud-based gaming explicitly require accurate and 65 low latency tracking; hence, for foveated rendering an eye tracker appears as the best option for such cases. However, 67 due to the viewing distance and relative motion between 68 the viewer and the display, eye-tracking is inconvenient for 69 large high-resolution display walls [26]. As an alternative, 70 for such setups, position and optical-tracker give an ap-71 proximate gaze position considering the observer's FOV 72 with higher latency. 73

#### 4.3. Ray-based versus raster-based techniques

Finally, the implementation of the degradation techniques may also vary depending on the rendering pipeline employed. In particular, while a large variety of combinations exist, ray-based techniques make it simpler to perform per-pixel adaptations, raster-based techniques typically favor model-space solutions. We, therefore, differentiate between ray-based and raster-based methods. Raybased and raster-based pipelines are directly available on modern programmable graphics hardware. Since foveated rendering requires real-time graphics, several pipelinespecific approaches have been implemented.

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

Typically, in foveated rasterization, the gaze point may be used to select geometric levels of detail for the displayed models, as well as an input for a fragment shader. The shader code will run a simplified fragment if it detects that the user is not looking at the current target pixel. These approaches make foveation easy to integrate with rasterization pipelines. Complications, however, arise from the implementation of realistic shadows, reflection, refraction, caustic effects, and global lighting, which often require the tuning of shadow mapping, reflection mapping, and other rendering techniques to cope with variable-resolution rendering [68].

On the other hand, the ray-based approaches are bet-98 ter applicable to photo-realistic graphics rendering since 99 the path of the rays is computed pixel by pixel [243]. Op-100 timization for foveated rendering is most often achieved 101 by reducing the number of rays in non-foveal areas. Ray-102 based techniques have shown the ability to easily simulate 103 complex illumination patterns, but, in real-time settings, 104 such techniques require important resources, especially for 105 dynamic objects, due to the need of recomputing spatial in-106 dexing to achieve logarithmic complexity [160]. Foreation 107 has shown to be an effective optimization technique due 108 to the massive potential reduction in the number of rays. 109 For foveated path tracing, Koskela et al. [118] provided a 110 theoretical estimation of performance gains available and 111 calculated that of the path rays can be omitted. For 112 this reason, they identified foreated rendering as an essen-113 tial technique to use path tracing within VR applications. 114

With the evolution of graphics pipelines, however, the 1 boundary between rasterization and ray tracing is becom-2 ing more and more blurred. Ray-casting or even ray-3 tracing may be performed in fragment shaders, while ras-4 terization is often used for the view rays in a ray tracing 5 or path tracing solution. In our classification, we will, 6 nonetheless, conserve this distinction by presenting the various techniques in the setting in which they were origi-8 nally introduced, eventually cross-linking similar ray tracq ing and rasterization techniques. By doing so, we aim to 10 provide a view of the evolving landscape of foveated ren-11 dering implementation frameworks. 12

#### 5. Adaptive resolution 13

The first group of methods in our classification (Fig-14 ure 5) strives to reduce the peripheral resolution to ac-15 celerate the rendering process. This is the most com-16 mon approach in foveated rendering. Over time a wide 17 18 range of techniques has been developed, such as *adaptive* sampling mask, multi-resolution pyramid, discrete cosine 19 transform (DCT), wavelet transform, log-polar transform, 20 log-rectilinear transform. The adaptive resolution is appli-21 cable on CPU, GPU, and even on a hybrid architecture. 22 Besides, both ray-based and rasterize graphics pipelines 23 have been used to reduce resolution, few techniques even 24 combine both pipelines. Unconventional approaches in-25 clude mostly dual display setup, e.g., inset-based projec-26 tion, overlapped region, and focus plus context. Recent 27 progress of AR displays, especially holographic, varifocal, 28 and light field displays rely heavily on the adaptive resolu-29 tion to reduce rendering load. However, *flickering*, *pop-up*. 30 and other visual artifacts are often visible that require ad-31 ditional postprocessing. 32

In this section, we will survey the adaptive resolu-33 tion techniques according to our classification. A general 34 overview of the surveyed methods is presented in Table 1 35 for the general-purpose techniques, and in Table 3 for the 36 methods tightly bound to a specific hardware setup. In the 37 following, we will first discuss each of the subclasses (see 38 Sec. 5.1–5.6), before summarizing our findings (Sec. 5.7). 39

#### 5.1. Static ray-based techniques 40

Ray-based rendering techniques (see Table 1), such as 41 ray tracing, path tracing, and ray casting, are well adapted 42 to foveated rendering because of the adaptive sampling 43 control over the frame, high-quality shadows, reflections, 44 refraction, translucency, caustic effects, and other visual 45 qualities. 46

Static real-time *foveated ray tracing* systems reduce spa-47 tial sampling by imitating the human non-uniform and 48 sparse vision characteristics, typically assuming that the 49 viewer is looking at the center of the display. This ap-50 proach is often used for near-eye displays. Fujita and 51 Harada [69], for instance, developed a foveated ray tracer 52 for a headset, in which the sampling pattern is distributed 53

with  $^{/}$  , where  $\,$  is the angular distance from the display center. To avoid artifacts due to sparse sampling, pixel colors are computed by averaging a set of neighboring samples in the image plane.

Pohl et al. [177], in a head-mounted display (HMD), combined density reduction due to foveation with the fact that lenses in modern consumer HMDs introduce distortions like astigmatism, in which only the center area of the displayed content can be perceived sharp while, with increasing distance from the center, the image gets increasingly blurred. This reduction is encoded in display-specific precomputed static sampling maps, which are images that encode the number of sampling rays per pixel (255 being the maximum of allowed supersampling). Moreover, they achieve considerable speed-up by combining density control with image quality control. In particular, in addition to lowering density inside areas, they employ high-fidelity CPU ray tracing in the display center, and faster GPUaccelerated rasterization in the periphery. Moreover, pixels that are very far from the center are not rendered upon head motion, reusing pixels from previous frames to avoid illumination changes [178]. This hybrid technique significantly improves the graphics quality at higher frame rates: with user-specific calibration, the demonstrated rendering speedup reached up to 77% on several benchmark scenes. This method was later extended to dynamic gaze tracking using an eye tracker [179] (Sec. 5.4). Recently, Yang et al. [253] varied the ray tracing rate based on scene specific information to reduce the number of shading samples. The particular use case is the usage of path tracing for computing illumination in a deferred shading pipeline. Sample rate is reduced by combining a foveation terms with terms depending on BRDF complexity and distance to viewer. Results demonstrate speed-ups of up to 30%.

Static foreation has also been used for other types of displays. For instance, Wei and Sakamoto [238] use density reduction to optimize rendering speed for an experimental holographic display. Such a display technology simulates the recording part of traditional optical holography by using a computer, saving light information as electronic data called an interference pattern. This approach, however, requires a large amount of calculation. Therefore, for foveated rendering, instead of adapting pixel density, they reduce the angular resolution of these calculations depending on the distance from the look-at point, assumed at the center of their display. Only the area within  $\circ$  to the center is rendered at full resolution, while the rest (up to  $^{\circ}$ 100 on their experimental display) uses a lower angular sam-101 pling rate. The static setup makes it possible to exploit 102 the precomputation of sampling patterns. 103

#### 5.2. Dynamic ray-based techniques

Dynamic techniques receive new gaze information at 105 each frame and must update the display with low latency. 106

The *first group* of techniques in this area is purely ray-107 based and achieves optimization by reducing the number 108 of rays and reconstructing images from sparse samples. 109

54

55

56

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

Algorithm used	References		Dyna	mic	c Pipeline	
Algorithin used	References		Eye-	Gaze-	Ray-	Raster-
			tracker	tracker	based	based
Adaptive ray tracing	Fujita and Harada [69], Wei and					
	Sakamoto [238], Yang et al. [253]					
Adaptive ray tracing	Levoy and Whitaker [127], Siekawa et					
	al. [201], Peuhkurinen and Mikkonen					
	[175]					
GPU-accelerated ray tracing	Weier et al. [242], Siekawa et al. [200]					
Luminance aware rendering	Tursun et al. [223]					
Dynamic sampling map	Pohl et al. [179]					
Hybrid approach	Pohl et al. [177]					
Hybrid approach	Pohl et al. $[180]$ , Friston et al. $[68]$					
Adaptive path tracing	Roth et al. [192]		7	Head		
Path tracing in log-polar	Koskela et al. [117]					
space						
Adaptive ray casting	Viola et al. [227]		1			
Adaptive ray casting	Zhang et al. [260], Bruder et al. [36]					
Adaptive ray casting	Ananpiriyakul et al. [10]			Face		
Head = head-tracker $Face =$	face-tracker					

Table 1. Summary of different techniques developed to achieve adaptive resolution, similar approaches are grouped together. Methods tightly bound to a specific hardware setup are presented separately in Table 3

Levoy and Whitaker [127] developed the earlier volumet-1 ric rendering with adaptive ray tracing, getting the gaze 2 points with an eye tracker. In the algorithm, depending 3 on the distance to the gaze point, three regions of a scene 4 are gradually sampled at of the native resand 5 olution and then blended for generating a continuous final 6 rendered image. Similar approaches have been later used 7 for *Whitted-style* ray tracing of simple scenes [201]. 8

With the introduction of programmable graphics q pipelines, several more elaborate approaches were intro-10 duced, with the goal of having a finer control of ray gen-11 eration and reducing artifacts, especially at the periphery. 12 Siekawa et al. [200] use GPU-accelerated ray tracing with 13 four different sampling masks for a nonuniform distributed 14 set of pixels to reduce the number of traced rays. To reduce 15 flickering artifacts in the periphery, which is very coarsely 16 sampled, strong temporal anti-aliasing (TAA) is applied. 17 Peuhkurinen and Mikkonen [175], instead, distributed rays 18 according to a log-polar transformation rather than dis-19 crete masks and demonstrated ray-tracing for simple sinces 20 on mixed reality application. Likewise, Weier et al. [242] 21 combine GPU-accelerated ray tracing with a depth of field 22 filter (DOF). The ray-tracing step in the algorithm sam-23 ples the image sparsely based on a visual acuity model, 24 and then the temporal stability of peripheral image re-25 gions is enhanced using reprojection-based TAA. Finally, 26 27 the complete image is computed from sparse samples using 28 pull-push interpolation, and gaze-contingent DOF is computed as postprocessing. Although the model was origi-29 nally developed for foveated artifact reduction, it also re-30 duces shaded samples up to 70%. 31

Tursun et al. [223] noted that, while previous foveated 32 solutions reduce resolution purely as a function of eccen-33

tricity, human visual sensitivity is also strongly influenced 34 by the displayed content. They thus studied the resolu-35 tion requirements at different eccentricities as a function 36 of luminance patterns, deriving a low-cost parameterized 37 model. The model is used in a multipass rendering tech-38 nique, which predicts the parameters from a low-resolution version of the current frame. As a result, the model proved to be capable, on benchmark scenes, to use only 47% of the 41 rays to render the foveated region, without visual artifacts 42 like pop-up effects and tunnel vision. For further speed-43 up, variable-rate shading [205], which distributes shading 44 samples over time, is also employed. The overall approach 45 benefits from the flexibility of the CUDA block-wise architecture.

39

40

46

66

The second category of algorithms is hybrid approach in 48 which both ray tracing and rasterization have been com-49 bined for faster computation. Pohl et al. [180] noted 50 that when the user is not looking at the center of a head-51 mounted display, not all of the image is seen. User tests 52 showed that, in their particular configuration, on average, 53 57% pixels were typically invisible in the entire frame. In 54 a fully ray-traced pipeline, they skipped rays detected as 55 invisible, while in a rasterization pipeline the invisible pix-56 els are stenciled out, avoiding shading computation. The 57 study was then extended by combining rasterization at the 58 periphery with ray-tracing at the center [179], also includ-59 ing dynamic sampling maps and lens astigmatism [178]. 60 For performance reasons, dynamic sampling maps are re-61 computed per frame depending on the current gaze at a low 62 resolution and interpolated to get the required amount of 63 rays per pixel. Taking into account the gaze point resulted 64 in a speedup of 20% with respect to the static solution. 65

Since multipass approaches are prone to introduce la-

Preprint Submitted for review / Computers & Graphics (2021)

tency, Friston et al. [68] introduced a single-pass rendering 1 technique based on a single perceptual rasterization pass. Their approach combines two solutions. First of all, they 3 implement rasterization into a frame buffer with a non-4 constant pixel density that peaks at the fovea. Each raster-5 ized pixel computes illumination with ray tracing. Second, 6 they update every column of pixels at different times. The latter feature can be used on HMDs with rolling displays, 8 such as Oculus Rift DK2, that illuminate different spatial locations at different times. As a result, they achieve a 10 performance similar to warping solutions, without the lim-11 itations with respect to disocclusions, object motion, and 12 view-dependent shading, while reducing the aliasing arti-13 facts of foveated techniques based on sparse ray sampling 14 at every frame. 15

A number of approaches generalize the above concepts 16 to foveated path tracing, the third category in our classi-17 fication, in which performance gains are achieved by con-18 trolling the shading complexity through the reduction in a 19 number of traced paths. As for the typical real-time path-20 tracing solution, the final image is generated by a denois-21 ing filter from the noisy result of path tracing. A notable 22 approach has been proposed by Roth et al. [192], based 23 on the NVIDIA OptiX framework. Their implementation 24 targets high-resolution displays in which the user's FOV 25 is precalculated, with more dense rays traced in the fovea 26 region, and sparser rays traced in the periphery, where a 27 Gaussian filter is also applied to blur the image to mask 28 aliasing problems. This third category is currently less ex-29 plored, mainly due to the difficulty of computing global 30 illumination in a very time-constrained setting with strict 31 latency bounds. A recent study by Koskela et al. [117] 32 implemented real-time path tracing in log-polar space. In 33 their benchmarks, both rendering and denoising achieved 34 a 2.5 in a VR setup. However, jittering effects could be 35 observed in both the fovea and periphery. 36

The *fourth set* of techniques is based on *foveated ray* 37 casting commonly used to render massive 3D models or 38 volumes. Ray casting is used here due to its flexibility and 39 efficiency in visibility computation in combination with 40 precomputed acceleration structures. The techniques used 41 in this area do not significantly differ from the previously 42 discussed solutions. Zhang et al. [260] present real-time 43 foveated ray casting base on adaptive sampling mask and 44 CSF with significant frame-rate improvement. Similarly, 45 Bruder et al. [36] develop ray casting technique derived 46 from Linde Buzo Gray sampling [54] and natural neighbor 47 interpolation that leverages visual acuity fall-off to speed 48 up volume rendering. Without any perceptible changes in 49 visual quality, this technique achieved speed up to 3.2 fold 50 51 on the presented benchmarks. Likewise, Ananpiriyakul 52 [10] apply adaptive ray casting on vector and volume visualization in which the step size increases along with ec-53 centricity, resulting in faster computation and interaction 54 latency decline. Interestingly, the approach uses a face-55 tracker instead of conventional gaze-trackers. 56

57 Dynamic ray-based techniques for adaptive resolution

are a well-researched and still very active area, where most of the literature in the 2014-2020 time frame were produced. This is because these techniques make it natural to finely and rapidly adapt sampling rates based on eccentricity and other measures. However, due to decreased ray density, artifacts like flickering are often visible in the periphery. Therefore, additional postprocessing, e.g., strong antialiasing [200, 242], and denoising [242] are essential.

#### 5.3. Static raster-based techniques

Rasterization based techniques produce images by projecting the scenes on a regular grid. This regularity is exploited by several foreation methods to design specialized adaptive sampling and reconstruction techniques (see Table 2).

The wavelet transformation is, in particular, at the root of the major rasterization-specific approaches to foveation. In the wavelet domain, the images are decomposed into different components and frequencies [141] in which each level can represent the different scales of information. In the context of foveation, wavelet representations are often used to control the sampling rate both in image space, to control the number of samples, and in object space, to control the sampling. In particular, variable resolution for foveated volumetric representations can be achieved by controlling the number of wavelet coefficients. Chang et al. [42] employ the Gaussian smoothing function as an integral operator and analyze its kernel for achieving space-variant degradation. Piccand et al. [176] develop volume data visualization technique based on 3D Haar wavelet transformation. In this approach, the ROI is rendered at full resolution, while contextual areas at coarser resolution are rendered through wavelet splatting. One main drawback of this method is that the contextual region pixelates due to the combination of Haar wavelets with splatting. Yu et al. [258] render volume data using wavelet coefficients under selected tracked rays. This is a two-step process: rapid reconstruction of the super-voxels from wavelet coefficients, and then render the super-voxels by tracking rays with different thicknesses. To reduce staircase artifacts, a space-variant smoothing filter is applied.

Variable spatial resolution is also achieved by using standard rasterizers with different configurations in the various areas of the screen. A prominent example is the rendering framework proposed by Malkin et al. [140], that assembles the final image from square fragments rendered separately, each of which has been blurred according to the distance from its midpoint to the point of fixation. Such a decomposition into tiles allows for an efficient parallel CUDA-based implementation.

Rasterization-based techniques are also often used in conjunction with nonconventional display setups, such as near-eye displays or light-field display. Since most of these methods have been specifically designed to take into account display-specific features, they are described in a separate section on Hardware-oriented techniques (Sec. 5.5).

11

64 65

66

67

68

69

70

58

59

60

61

62

63

71 72 73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

100

101

102

103

104

105

#### Preprint Submitted for review / Computers & Graphics (2021)

Algorithm used	Boforoncos	Static	Dyna	mic	Pipe	eline
Algorithmi used	Itelefences		Eye-	Gaze-	Ray-	Raster-
			tracker	tracker	based	based
Wavelet transformation	Chang et al. [42], Yu et al. [258], Pic-					
	cand et al. [176]					
CUDA opt. architecture	Malkin et al. [140]					
Adaptive sampling	Vieri et al [226]					
Adaptive sampling (3 layer)	Guenter et al. [80], Finch et al. [63],					
	Marianos [148]					
Adaptive sampling	Cuervo and Chu [51]			Head		
Adaptive sampling (2 layer)	Swafford et al. [209], Bektas et al. [27],					
	Lungaro and Tollmar [138]					
Adaptive sampling (2 layer)	Watson et al. [235]			Mouse		
Multi-layer pyramid	Perry and Geisler [72, 174, 73]		Y	Mouse		
Spatiotemporal filtering	Bohme et al. [34]					
Log-polar transform	Meng et al. [156, 154, 155]					
Log-rectilinear transform	Li et al. [128]					

Table 2. Summary of different raster-based techniques developed to achieve adaptive resolution, similar approaches are grouped together.

Head = head-tracker holo = holographic display

#### <sup>1</sup> 5.4. Dynamic raster-based techniques

The most explored foreated rendering research area 2 comprises dynamic raster-based techniques that vary lo-3 cal image resolution in response to gaze changes (see Ta-4 ble 2). Due to the need for low-latency and high fre-5 quency display, these techniques must employ several op-6 timization schemes that permit fast adaptivity in conjunction with moving ROIs. In this section, we discuss sub-sampling [80, 63, 148, 226, 51, 209], multi-layer pyramid [72, 174, 73, 34], and log-polar transformation 10 [156, 154, 250, 128] which are used to achieve adaptive 11 resolution. 12

The first set of techniques is based on compositing dif-13 ferent resolution images to quickly produce a foveated dis-14 play. The most classic technique is to use a multi-pass ap-15 proach, in which several image layers around the tracked 16 gaze point are rendered at progressively higher angular 17 size but lower sampling rate, and then rescaled and com-18 posited to produce the final multi-resolution image. For 19 instance, Guenter et al. [80] introduced a multipass ras-20 terization pipeline for 3D graphics based on the acuity 21 fall-off model proposed by Levoy et al. [127], in which the 22 scene is rendered on three nested and overlapping render 23 targets centered around the current gaze point. The inner 24 layer is smallest in angular diameter and rendered at the 25 native display resolution, while the two peripheral layers 26 cover a progressively larger angular diameter but are ren-27 dered at a progressively lower resolution and bilinearly up-28 sampled before merging them with the others. Note that 29 this system also used coarser scene LODs for peripheral 30 layers (see Sec. 6) and updated them at half the tempo-31 ral rate (see Sec. 8). Through this approach, half of the 32 shading cost was saved with a 5-6 times overall graphics 33 performance improvement demonstrated on a desktop HD 34 display. The system was later extended for a tiled 35

LCDs, demonstrating up to 10-15 times less rendering cost with 6-8 times average speedup [63]. The reduction in the 37 density of peripheral layers leads to distracting strobing 38 and crawling artifacts and makes anti-aliasing based on 39 super-sampling harder. For this reason, the cost of anti-40 aliasing is also amortized over multiple frames, using a 41 combination of multisample antialiasing (MSAA), tempo-42 ral reverse reprojection [165], and temporal jitter of the 43 spatial sampling grid [49]. 44

Many follow-ups used the same architecture. For in-45 stance, Marinos [148] use three layers: 100%, 60%, and 46 40% resolution which depends on the Euclidean distance 47 from ROI. Likewise, Cuervo and Chu [51] investigate the 48 panoramic stereo video and likelihood-based features in 49 which the video is subdivided into three regions: high, 50 medium, and low resolution. An integrated convex-like 51 optimizer adapts to real-time head movement and reallo-52 cates pixels according to the motion. In contrast, instead 53 of three layers, Swafford et al. [209] use two sample lay-54 ers, full resolution in the fovea and resolution in the 55 periphery. Lungaro and Tollmar [138] also employ dual 56 resolution on the video delivery framework by applying an 57 optimized foveal mask to each frame. Such a 2-layer ar-58 chitecture was also used in early user studies [235] that 59 demonstrated that lowering resolution in the periphery of 60 HMDs did not affect user performance on complex visual 61 search tasks. This multiple-image rendering architecture 62 is also used to drive recent VR displays, e.g., the very 63 high-resolution display by Vieri et al. [226], a 4.3" OLED 64 display with 18 y, and 120 Hz refresh rate. 65

Since reducing resolution is prone to introduce visible artifacts, other authors have presented architectures that improve image quality by supporting compositing and filtering of multiple images. The *second group* of methods is used to create a space-variant resolution to the periph-70

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

99

ery, is known as Multi-Layer Pyramid (MLP). Geisler et 1 al. [72] combine CSF with MLP for faster video commu-2 *nication* over low bandwidth networks. In this procedure, 3 the entire scene is divided into six levels, and each level 4 is then motion-compensated, multi-resolution coded, and 5 quantized based on HVS. Finally, lossless encoding and 6 foveated video quality assessment metrics have been integrated into foreated compression algorithm. Similarly, 8 Perry and Geisler [174, 73] use MLP with filtering at each pixel location, achieved by interpolation between levels 10 of the pyramid using the resolution map. Derived from 11 the gaze-directed spatial resolution function developed by 12 Perry and Geisler [174, 73], Böhme et al. [34] employ 13 a gaze-contingent spatiotemporal filtering technique that 14 uses a *resolution map* to specify the optimal temporal res-15 olution at the ROI. As a result, the authors claim smooth, 16 17 and artifact-free real-world video output.

While the above techniques partition the image into 18 small set of discrete areas that are then composited, a 19 an alternative approach is to directly produce a seam-20 less variable-rate image by warping the angular distribu-21 tion. The third category of algorithms is based on log-22 arithmic transformation. Meng et al. [156] develop the 23 kernel foveated rendering (KFR) technique in log-polar co-24 ordinate. In the method, first, a log-polar transforma-25 tion has applied in the buffer memory, and then inverse 26 log-polar transformation with anti-aliasing has applied to 27 reduce the resolution. However, in the presented bench-28 marks, the technique achieves 2.0-2.8 times speedup for 29 3D texture meshes and 2.9-3.2 fold better performance 30 than ray casting rendering on a 4K-UHD. In an exten-31 sion, Meng et al. [155] use eye dominant feature that 32 implements a lower foreation rate for the dominant eve 33 than the non-dominant. In comparison with KFR [156], 34 an additional 1.06-1.47 times speedup was achieved. In 35 another study, Meng et al. [154] extend the KFR to 3D 36 light field display. The 3D-KFR is parameter-dependent, 37 embedding polynomial kernel functions in the classic log-38 polar mapping. Nonetheless, there are two key research 39 challenges in KFR methods, *first*, the user-dependent opti-40 mized parameters that make it difficult for practical imple-41 mentation, and *second*, artifacts such as flickering are fre-42 quently visible. To reduce artifacts, Li et al. [128] use log-43 rectilinear foveated rendering. Results from this research 44 prove that log-rectilinear transformation with summed-45 area table sampling against log-polar transformation ef-46 fectively reduces flickering artifacts and saves bandwidth. 47 Other dynamic rasterization-based techniques have been 48 also developed to take into account the special character-49 istics of nonconventional displays. Those methods are de-50 scribed in a separate section on Hardware-oriented tech-51 niques (Sec. 5.6. 52

#### 5.5. Static hardware-oriented techniques 53

While the approaches discussed so far are general-54 purpose techniques for achieving variable resolution across 55 images, several methods have been designed for partic-56 ular displays with unconventional characteristics. These 57

include, e.g., dual displays [77, 78, 3], varifocal displays [247, 256], and holographic displays [85, 139, 123, 100]. Here and in the following section, we cover such hardwareoriented approaches to achieve adaptive resolution, focusing in particular on how raster-based and ray-based techniques have been adapted to those configuration (see Table 3). In this section, we will first focus on static configurations with a fixed gaze point, while in the next we will cover the dynamic case.

The first set of techniques uses a physical dual-display setup to achieve variable resolution. A typical design is the earlier foreated dual display approaches, which were mainly inset-based, with higher resolution at the center and coarser resolution elsewhere. On these displays, rendering techniques typically need to perform two renderings and take into account continuity between the presented images. Godin et al. [77, 78] designed a dual-resolution foveated stereoscopic projection setup that superimposed images with opposing polarization that is suitable for exploring large models and environments consists of high geometric and texture complexity (the display setup targeted over 10 megapixels). However, there are few downsides, e.g., color, resolution, brightness variation, and the line between different projectors. Therefore, image warping is applied as a part of the rendering pipeline to overcome these challenges. Ahlborn et al. [3] introduce a multi-projector wall where the coarser-resolution is projected from a rear projector. To modify the OpenGL pipeline without modifying application code, they implemented the inset controller as a Chromium SPU. Another front projector with a mechanical *pan-tilt mirror* projects small though highresolution images overlapped. Baudisch et al. [24, 23] develop a focus plus context (FPC) display in which foveation is possible during image acquisition. Besides, Shimizu [199] develops an advanced wide-angle foreated (AdWAF) model that uses an especial lens to distort the acquired image geometrically into four regions by combining both Cartesian and logarithmic coordinates. As compared to a log-polar model, the AdWAF model minimizes image data by more than 13%.

The *second* set of techniques is explicitly developed 98 for near-eye image presentation. Sometimes, displays in this category are explicitly designed taking into account 100 foveation in their design, but no particular rendering tech-101 nique is required, besides taking into account the fixed 102 variable angular resolution of the display. One example 103 is the varifocal AR display of Wu and Kim [247], which 104 allows retrofitting a medically prescribed lens with a vari-105 focal lens for vision correction. Remarkably the prototype 106 can achieve angular resolution up to 22 cpd for the virtual 107 image at the center ° where the rest see-through display 108 has a uniform 32 cpd resolution. Another typical exam-109 ple in this category is the near-eye display of Yoo et al. 110 [256], which uses a fixed high resolution at the fovea and a 111 lower resolution in the periphery, exploiting polarization-112 dependent doublet geometric phase lens and temporal po-113 larization multiplexing methods to produce the images. 114

#### Preprint Submitted for review / Computers & Graphics (2021)

Algorithm used	References	Static	Dyna	amic	Pipeline	
Algorithm used	References		Eye-	Gaze-	Ray-	Raster-
			tracker	tracker	based	based
Multi-layer point cloud (holo)	Hong et al. [85], Hong et al. [100]					
Phase-only (holo)	Maimone et al. [139]					
Multi-layer with PSF (holo)	Lee et al. [123]					
Multi-layer (var)	Wu and Kim [247]					
Geometric phase lens	Yoo et al. [256]					
Dual projector	Godin et al. [77, 78], Staadt et al. [3]					
Focus plus context	Baudisch et al. $[24, 23]$					
Wide angle lens	Shimizu [199]					
Electronic circuit board	Park et al. [169], Bae et al. [18]					
Adaptive resolution (var)	Kim et al. [110]					
Dual display	Benko et al. [28]		<b>Y</b>			
Dual display	Tan et al. [213, 214]			PBPD		
Dual layer LCDs	Gao et al. [71]					

Table 3. Summary of different hardware-oriented techniques developed to achieve adaptive resolution, similar approaches are grouped together.

PBPD = Pancharatnam-Berry Phase Deflector var=varifocal display holo = holographic display

Holographic displays, with respect to standard binoculars, use wavefront modulation to offer full depth cues. 2 These displays require large amounts of computation to 3 compute the diffraction patterns, and using adaptive reso-4 lution is essential. The first set of solutions perform holo-5 gram synthesis in real-time from 3D point clouds using 6 the Rayleigh-Sommerfeld diffraction formula. To achieve foveation, the data is represented as a multilayered point 8 cloud, in which each layer has a different density according to MAR[85]. This model was then adapted to combine 10 the holographic and two-dimensional displays to provide 11 3D images near the fovea and 2D images at the periph-12 ery [100]. Moreover, the point cloud is upsampled in the 13 periphery to avoid holes. Maimone et al. [139] concen-14 trated, instead of the design of a *phase-only* holographic 15 projection with a spatial light modulator, showing how 16 true 3D holograms can be generated directly from the 17 18 output of the standard graphics pipeline through a postprocessing step. In particular, they introduce a real-time 19 computation method based on linearly separable convo-20 lution to achieve spatially variant focus and aberration 21 correction for eye-tracked displays. The prerequisite for 22 high-speed computation is a spatially invariant lens phase 23 function, which implies that the focus and aberration cor-24 rection is constant over the image. Foreation is exploited 25 by providing the correct lens function where the user is 26 looking rather than computing or approximating the full 27 spatially variant solution. 28

Multi-layered displays, by contrast, can provide continu-29 ous focus cues within a working range by decomposing 3D 30 scenes into 2D layer images, that can be presented through 31 a variety of optical designs. Lee et al. [123] use for that 32 purpose a light guide and a holographic lens. The major 33 problem for such displays is to compute the layer images 34 and computationally optimizing them to provide appro-35 priate focus cues. Instead of using simple depth-weighted 36

blended, per-image weights are optimized by comparing 37 perceived retinal images with target retinal images accord-38 ing to the focal depth of the eyes. Foveation and eye move-39 ment are taken into account by minimizing the degradation 40 of contrast within the fovea while considering a large eye 41 box enlarging the eye box that takes into account possible 42 eye movements. Contrast ratio curves and visual differ-43 ences (HDR-VDP2) [145] are used for that purpose. The 44 method has the drawback of being very sensitive to calibra-45 tion and requires important computation resources, with 46 the prototype achieving 10Hz for a 00 0 retinal image 47 on an NVIDIA board. 48

49

#### 5.6. Dynamic hardware-oriented techniques

A number of specialized hardware solutions to create 50 displays that adapt resolution based on user's gaze. The 51 first set of techniques is based on physical dual displays, 52 complementing the dual display solutions presented in sec-53 tion 5.3 with components dedicated to dynamic gaze track-54 ing. As for the static case, the only notable variations in 55 terms of rendering algorithms are related to aspects needed 56 to cope with particular display features. A typical exam-57 ple is given by Benko et al. [28], who couple a tracked 58 optical see-through display with a projector-based spatial 59 AR display. Their multipass approach renders the scene 60 five times: twice for the glasses (once for each eye), once 61 for the projected periphery, once for the projected inset, 62 and once for the projection mapping and compositing pro-63 cess for the projector view. The projected inset renders occlusion shadows for the glasses content or only shows 65 the surface shaded content that is not view-dependent. 66 Visual discontinuities are reduced by applying a smooth 67 transition between the periphery and the inset. Similar 68 multi-pass rendering techniques can be applied to the dis-69 play design of Tan et al. [213, 214], who achieve the re-70 alization multi-resolution foveated display panel with a 71

Preprint Submitted for review / Computers & Graphics (2021)

combination of two separate OLED panels and a beam 1 splitter which is used as an optical combiner. The first 2 monitor has a wide FOV but low resolution, while the 3 second display has super high resolution in the central 4 °. For dynamic foveation, a switchable liquid region 5 crystal-based Pancharatnam-Berry Phase Deflector is ap-6 plied that shifts the high-resolution regions with contents. However, the Pancharatnam-Berry Phase Deflector can be replaced with an eye tracker. As for Benko et al. [28], each physical display is handled by a different rendering pass. 10

The *second set* of techniques is developed to achieve 11 foveated resolution through *electronics circuit*. Park at 12 al. [169] assumes that the renderer performs a vertical 13 resolution reduction depending on the Euclidean distance 14 from the gaze point, while keeping the horizontal resolu-15 16 tion fixed. A specialized circuit using multiple line driving gate drivers then decompresses the image for display. Sub-17 jective assessment, PSNR, and SSIM indexes proved that 18 the foveation-based driving scheme can be used without 19 causing any noticeable deterioration. Since the display 20 Rendering techniques must be aware of display resolution 21 to suitably distribute pixel samples. Bae et al. [18] per-22 form instead an adaptation in both horizontal and vertical 23 direction by proposing a variable clock generation circuit to 24 manipulate output waveforms of shift registers for OLED 25 display. The electromagnetic circuit, which is made up 26 of four thin-film transistors and one capacitor, generates 27 pulses with variable widths that correspond to twelve res-28 olutions in the display region. The above-mentioned ren-29 dering method can be directly employed to speed up the 30 rendering for these variable resolution displays. 31

The third group of foveated techniques is designed for 32 unconventional displays, such as *light field*, and *varifocal* 33 displays. In contrast to conventional near-eye displays, 34 these displays can create better visual cues and an immer-35 sive experience. Gao et al. [71] combine dual-layer LCDs 36 and magnifying lenses to develop a *light field display*. In 37 the system, a Hadamard product [112] of two-layer patterns 38 is used to restore the light field scene. Besides, the LCDs 39 need to be flipped vertically, and the optical distortions 40 are calculated in post-processing. Kim et al. [110] design a 41 state-of-the-art foreated varifocal AR display in which the 42 resolution and focal depth cues are driven by eye-tracking. 43 Besides, the display combines a traveling microdisplay, a 44 concave half-mirror magnifier, and a laser projector-based 45 Maxwellian-view display. Since the overlap between the 46 fovea and periphery is visible, a *stencil mask* to the outer 47 paths of the foveal image is used. 48

#### 5.7. Discussion 49

Achieving adaptive resolution through foreated render-50 ing is a wide research domain. One common use of foveated 51 rendering is to subsample various regions of a scene to dif-52 ferent resolutions and blend them. The number of lavers 53 used in various studies varies, for example, two [209, 51], 54 three [80, 63, 148], and even six layers [72] have been used. 55 Further, a distinct subsampling ratio also has been applied. 56

sampling rate for three layers by However, the [127] have been widely adopted in [80, 238]. Nonetheless, these techniques are not free from artifacts like flickering and require strong TAA in post-processing. Among other algorithms, the wavelet transformation [42, 258, 176] suffers from sudden pixelation, and consequently smoothing filtering like Gaussian is required. Along with other aspects, the log-polar transformation [156, 155, 250] calculation is parameter-dependent, and a time-consuming user study is prerequisite for optimization.

Since ray-based methods allow arbitrary sampling patterns in screen space, foveated techniques can apply more easily than rasterization. Due to the GPU robustness and affordable price, the foveated ray tracing has gained much interest in recent years [69, 238, 201]. Moreover, the CUDA architecture that supports the implementation of both ray tracing [223], and rasterization [140] through general-purpose parallel programming techniques offers large flexibility. In recent years, the boundary between rasterization and ray tracing is becoming more and more blurred, and hybrid approaches are emerging [68, 177].

While foreation can be applied to standard displays, it is increasingly employed in conjunction with new technologies such as varifocal, light field, and holographic displays. There are several advantages of these displays; e.g. achieving continuous visual cues, and solutions for vergence and accommodation conflict that lead to fatigue for near-eye 2D displays with OLED/LCD. Among other advantages, the varifocal AR display can reach large FOVs  $^\circ)$  coupled with high angular resolution (e.g., (e.g., 60 cpd angular resolution in the fovea [110, 247], while more traditional displays are typically much more limited (e.g., achieving a maximum  $0^{\circ}$  FOV and 10-15 cpd of angular resolution). However, several key research challenges exist in unconventional displays. In particular, most of the holographic, varifocal, light field display research is limited to static foveation, however, and dynamic foveation solutions have started to appear only recently [110, 103]. The rendering complexity for these displays (especially for holographic ones) is also very high, and most presented solutions are limited typically to simple scenes using simple shading models, most of the time demonstrated in standard rasterization pipelines (see table 1). Extending these displays to the photorealistic rendering of complex scenes 100 is an open research challenge. 101

Dual-display setups are a very common solution found in 102 foveated rendering. Projection-based dual display setups 103 emerged as a viable solution to achieving higher resolution 104 through projection on large screens. However, at present, 105 this solution is being employed more and more frequently 106 for near-eye displays, which use the technique to combine 107 a large resolution at the fovea with a wide FOV (e.g., [28, 108 213, 214]. 109

### 6. Geometric simplification

The second group of methods in our classification (Fig-111 ure 5), instead of, or in addition to, reducing image res-112

15

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

16

Preprint Submitted for review / Computers & Graphics (2021)

olutions, strives to improve performance by adapting 3D 1 geometric complexity. This approach is essential since the 2 geometric complexity of detailed scenes heavily impacts 3 the rendering time. Model simplification, or level of detail 4 (LOD), was among the earliest techniques used in con-5 junction with foveation. It is based on the observation 6 that much of the complexity in a realistic 3D model is redundant when rendering the model from a given per-8 spective since individual details may become too small to 9 be perceived [137]. Standard adaptive rendering technique 10 vary density based on factors such as distance, size, veloc-11 ity, and eccentricity [149], as well as semantics, and frame 12 rate[70]. For each techniques may be employed in isola-13 tion or in conjunction with these other approaches. Nowa-14 days, gaze-tracked geometric simplifications are among the 15 most widely used techniques to accelerate the rendering 16 process[219]. Table 4 provides an overview of the differ-17 ent geometric simplification techniques used in foveated 18 rendering. In the following, we will summarize the vari-19 ous subclasses of geometric simplification techniques and 20 provide a general discussion of the state-of-the-art in this 21 area. 22

#### 23 6.1. Ray-based techniques

Ray-based techniques typically use acceleration struc-24 tures, which achieve a rendering time that depends log-25 arithmically on scene complexity. For this reason, geo-26 metric simplification is typically used only on very large 27 scenes, and only a few studies explored ray-based meth-28 ods for reducing geometric complexity in conjunction with 29 foveation, especially in the case of dynamic gaze tracking. 30 A representative example is given by the work of Weier et 31 al. [241, 240], proposing a ROI-based geometric simplifi-32 cation model for large high-resolution display. The focus 33 area is detected by tracing rays from the detected user po-34 sition and intersecting the central viewing cone with the 35 display. Since the display plane is seen at an angle, the 36 authors model the focus area as an ellipse rather than a 37 circle. Multi-resolution rendering is implemented by using 38 the inner nodes of a *sparse voxel octree* data structure [122] 39 as approximate representation, and the polygonal nodes of 40 the original scene as a high-detail approximation. Due to 41 the difficulty of rebuilding the sparse voxel octree on the 42 fly, the system is tested only on static scenes. To indi-43 vidually decide when to stop traversing, a metric based 44 on the distance of the ray to the central ellipse is used. 45 Since hard transitions between levels are disturbing, the 46 image at the periphery is blurred with a Gaussian filter 47 with a fixed width. Similar user position-based LOD is 48 also used in a rasterization pipeline by Scheel et al. [195] 49 which is discussed in the next section. Other solutions, 50 instead, produce continuous images by continuously vary-51 ing the ray density and geometric LODs as a function of 52 eccentricity. A representative example is given by the ap-53 proach of Murphy and Duchowski [163]. In their approach, 54 the scene geometry is sampled by ray casting, with a ray 55 distribution conforming to the angular frequency dictated 56

by a Contrast Sensitivity Function (CSF). This sampling generates an intermediate mesh, which is then further refined to preserve silhouette edges and rendered in place of the original geometry. One notable finding from this study is that the search time decreases with the foveated window size increment (up to  $0^{\circ}$  eccentricity).

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

### 6.2. Raster-based techniques

Raster-based techniques that adapt geometric complexity at each frame to meet performance constraints are the most classic approach for time-critical rendering [257]. Early approaches (e.g., [70, 149]), already used heuristic functions based on eccentricity with respect to a static gaze point (typically the screen center) to determine the level of detail. Use of the CSF for view-dependent polygonal simplification is also well established (e.g., [136, 184]). The acuity fall-off models used in these early works were later extended to dynamic gaze situations, in conjunction with eye trackers.

In an early geometric simplification model developed by 75 Ohshima et al. [167], six different levels from the set of 76 hierarchical geometric models are selected to be rendered 77 according to the Euclidean distance from the ROI. In ad-78 dition, this model exploits HVS subdividing the visual re-79 gions into central, peripheral, kinetic, and fusion zones. 80 It is interesting to note that, since discrete LOD switch 81 causes notable artifacts, the updating is postponed dur-82 ing saccade movements. While the method is designed for 83 eye-tracking, the presented results were only for a head-84 tracking situation. Later approaches switched to continu-85 ous LODs to provide a much finer adaptation granularity 86 and reduce LOD switching artifacts. Luebke et al. [137], in 87 particular, used a multi-resolution mesh model supporting 88 view-dependent-simplification to propose gaze-directed ge-89 ometric simplification technique based on contrast match-90 ing function and Kelly's temporal contrast sensitivity func-91 tion [108]. Results demonstrate good quality images with 92 only one-third of the total number of polygons for bench-93 mark scenes. However, in their implementation, temporal 94 contrast sensitivity is not considered. Murphy et al. [162] 95 also used a multi-resolution mesh representation to ren-96 der objects in a gaze-contingent manner. This is achieved 97 by recursively subdividing triangles that are larger than 98 the local resolution provided by an acuity-based function 99 depending on eccentricity with respect to the gaze point. 100 This is the first study to use binocular eye tracking inside 101 a head-mounted display. These general LOD-based ap-102 proaches were later applied, with minimal variation, for a 103 variety of different applications, including rendering mod-104 els coming from 3D scanning [44] or large terrains [195]. 105 In a visual search study using an eye tracker on a desk-106 top display, Parkhurst and Niebur [170] rendered objects 107 at the point of gaze in more detail than objects in the 108 periphery. They found that, while search times increase 109 with decreasing LODs beyond a critical threshold, the re-110 sulting increase in frame rate facilitates virtual interac-111 tion. Later studies found that contrast is a better pre-112 dictor of the overall search performance and perceptibility 113

#### Preprint Submitted for review / Computers & Graphics (2021)

Table 4. List of different geometric simplification techniques; similar techniques have been clustered together.						
Almonithms used	Defenences	Static	Dyna	amic	Pipe	eline
Algorithin used	References		Eye-	Gaze-	Ray-	Raster-
			tracker	tracker	based	based
Mesh simplification	Ohshima et al. [167]			Head		
Textured mesh simplification	Luebke et al. [137]				/	
Polygon simplification	Luebke and Hallen [136]					
Texture simplification with	Funkhouser and Sequin [70]					
3D mipmap						
Level of detail (LOD)	Reddy [149, 184]					
LOD	Murphy and Duchowski [162],					
	Parkhurst and Niebur [170]					
LOD	Scheel et al. [195]			Optic		
LOD	Bektas et al. [27]			Mouse		
LOD (holo)	Ju and Park [103]			Mouse		
Adaptive tessellation	Papadopoulos and Kaufmann [168]			Head		
Adaptive tessellation	Lindeberg [131], Zheng et al. [262]					
Adaptive tessellation	Tiwary et al. [219]			Mouse		
Curvature 3D simplification	Cheng [44]					
Sparse voxel octree	Weier et al. [241, 240]		7	Optic		
CSF-based ray mask	Murphy et al. [163]			Head		
Head = head-tracker Ontic = Ontical-tracker						

than feature size, and, thus, variable resolution rendering, is mostly beneficial if detail is added to low contrast regions first [234]. LOD rendering is also used in conjunction with non-conventional displays. For instance, Ju and Park [103] exploited levels of detail to speed-up the generation of computer-generated holograms for AR applications on a near-eye holographic display. The algorithm computes the angular spectrum of individual meshes, aggregates them in a hologram plane, and then Fourier transforms them to produce the complex wave field of the entire scene. LODs 10 are used to adapt the density of meshes so that they are 11 higher at the fovea. Adapting the mesh density through 12 mesh adaptation improves over the prior point-based ap-13 proach [238, 85, 84, 100] that simply adapts point density, 14

One of the main limitations of early LOD techniques was 16 the low granularity of LOD approaches and the limited 17 performance of continuous LOD solutions, which made 18 them difficult to apply in the very time-constrained setting 19 of foveated rendering. Several of the later methods started 20 to take into account the evolution of GPUs by amortiz-21 ing LOD computation efforts on groups of primitives (e.g., 22 surface patches), rather than computing the required level-23 of-detail at the single triangle or point level [47, 75, 76]. 24 With this approach, CPU utilization was minimized, and 25 applications could very quickly adapt the resolution even 26 when dealing with massive scenes. This solution was 27 adapted, e.g., for view-dependent rendering on a light-field 28 display [31]. 29

leaving vacant areas between points.

15

As an alternative to batching, several solutions have 30 recently exploited GPU tessellation to achieve the fast 31 adaptation time required by foveation applications. Linde-32 berg [131], for instance, introduced a depth of field tessel-33

lation, in which in conjunction with the reduction of tes-34 sellation levels our of the focus plane, there is an increase 35 of blurring with eccentricity. Importantly, the user study 36 shows that *pop-up artifacts* significantly decrease with the 37 increase in blur level, suggesting that the technique can be 38 used to hide the *pop-up effect*. An alternative solution, pro-39 posed by Tiwary et al. [219], instead, is to perform calcula-40 tions of tessellation levels only during saccadic motions and 41 to adapt the mesh only at fixations. Swafford et al. [210] 42 propose a method in which imperceptible triangles are 43 culled and then a tessellation shader parameterized with 44 the acuity fall-off model is applied. A similar approach 45 was also proposed by Zheng et al. [262]. Under multi-46 tiled LCDs, Papadopoulos and Kaufmann [168] present 47 acuity-driven 2D gigapixel imagery visualization using a 48 GPU-tessellation scheme for high-quality focus plus con-49 text lens and virtual texture rendering. The tessellation 50 level of the context area of the image and of the lens is cal-51 culated differently, taking into account both the position of 52 the viewer with respect to the screen and the deformation 53 applied by the lens. The results indicate that using the 54 high-quality focus plus context lens significantly reduces 55 visual artifacts while accurately capturing the underlying 56 lens function. Moreover, their parallel system saves up to 57 70% of the bandwidth and achieves frame rates of 7.5 fps, 58 compared to less than 2 fps for naive pre-tessellation that 59 does not take into account the user's gaze. 60

### 6.3. Discussion

All systems dealing with complex scenes to be rendered 62 within stringent real-time constraints must integrate tech-63 niques for filtering out as efficiently as possible the data 64 that is not contributing to a particular image. The goal is 65

Preprint Submitted for review / Computers & Graphics (2021)

to have rendering complexity proportional to the bounded
perceivable image size rather than to the potentially unbounded scene size. View-dependent geometric simplification has been one of the major building blocks of real-time
systems in this particular context [257]. In the context of
foveation, the general solutions are adapted to the particular conditions in which these techniques must operate.

First of all, several approaches include the definition of 8 adaptive metrics that drive simplification refinement based 9 on perceptual measures specific to foveation. Currently, no 10 single approach has emerged as a de-facto standard, and 11 techniques range from using just pre-determined simplifi-12 cation levels at the center or the periphery (e.g., [241]) to 13 locally adapting sampling rates based on perceptual func-14 tions e.g., [137, 163, 168]). Many of the methods adapt 15 these functions to display-specific situations. 16

17 Second, while typical adaptive rendering solutions slowly and smoothly vary tessellation as a function, e.g., 18 of distance to the viewer, foveated solutions tend to be 19 effective when simplification is applied in a much more 20 aggressive way, with a sharp decrease in details outside 21 of the focus area. The low level of detail in the periph-22 ery, however, is prone to introduce visible flickering ar-23 tifacts. For these reasons, geometric simplification tech-24 niques are seldom used alone, but are often combined with 25 a screen-space technique that blurs the low-detail areas 26 (e.g., [241, 240, 131]). 27

Finally, knowledge of gaze provided by high-frequency and high-precision trackers can be exploited to schedule computations and adaptation during the saccade and/or fixation periods, with the purpose of reducing costs and improving visual fidelity (e.g., [167, 219]).

# 7. Shading simplification and chromatic degrada tion

While the previously discussed classes achieve optimiza-35 tion by reducing the number of rendered pixels or geomet-36 ric primitives, the third group of techniques in our clas-37 sification (Figure 5) achieves optimization by adaptively 38 reducing the work or data required per pixel. We dedi-39 cate shader simplification (Sec. 7.1), and chromatic degra-40 dation (Sec. 7.2) under one single category, because the 41 works pursued in these categories have the common goal 42 of condensing the computation load of computing a photo-43 realistic representation. However, while shader simplifica-44 tion reduces the computational load of color computation, 45 chromatic degradation takes into account variable color 46 sensitivity, e.g., to reduce bandwidth or complexity of tone 47 mapping. 48

<sup>49</sup> In the following subsections, we first present an analysis <sup>50</sup> of recent literature on different shading simplification mod-<sup>51</sup> els (Sec. 7.1), and then investigate different techniques <sup>52</sup> developed for chromatic degradation (Sec. 7.2).

#### 53 7.1. Shading simplification

In advanced photorealistic rendering, as well as in illustrative rendering, computing the final color of each pixel may consume a significant proportion of computing resources, even for geometrically simple scenes. In recent years, several real-time graphics solutions have been employed for reducing rendering loads through the reduction of shader costs. A notable example is Variable Rate Shading (VRS), introduced in DirectX 12 graphics pipeline [205]. In foveated rendering, shader simplification optimizes the rendering time by using higher accuracy, but slower, methods in the focus area and simplified, but faster, ones in the periphery. The techniques include coarse shaders, multi-rate shaders, lighting, and occlusion simplification. In this section, we provide an analysis of the literature in this area.

56

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

### 7.1.1. Methods

In the context of shading simplification, there is not a sharp difference between ray-based and raster-based techniques, since most works use hybrid approaches. The most common configuration consists in ray-based shaders executing within a raster-based pipeline.

The fact that shaders can be used to naturally simulate general gaze-contingent stimuli was recognized early on. In particular, Duchowski and Coltekin [60] developed the first gaze-dependent fragment shader in which visual stimuli, such as color and luminance values were discarded in the periphery. This approach was designed, however, for foveation simulation, and not for optimization, and was used in a variety of applications. For instance, in their *space-variant visualization* framework, Bektas et al. [27] implement the degraded quality using pixel shader (GLSL language). This gaze-contingent display also can manage the level of detail (LOD) using a weighted Euclidean distance between any pixel and the gaze point in 2D space.

Later, shader techniques were also employed to reduce workload in addition to simulating foveation effects. Since shader simplification works well when the high-quality shader must do complex computations, the technique is often applied when using global illumination models, which must perform integration to aggregate realistic lighting information. Moreover, due to the inherent real-time adaptation features, these methods adapt well to dynamic gazetracking.

For instance, global illumination with the ambient oc-97 clusion shader model improves photorealism through shad-98 owing the ambient light of nearby objects. Mantiuk and 99 Janus [144] propose a gaze-dependent hybrid model in 100 which the ROIs are rendered with *ambient occlusion*, with 101 a number of ambient occlusion sampling rays decreas-102 ing with eccentricity, and areas outside the ROI with lo-103 cal Phong shading. On the presented benchmarks, the 104 method achieved a performance boost up to 276% in the 105 best-case scenario, and on average 140.07% without nega-106 tively affecting user performance. The approach was later 107 extended by the same authors to gaze-dependent screen-108 space ambient occlusion (SSAO) [143]. In the implementa-109 tion, ROIs have 32 samples per pixel, while the sampling 110 rate is gradually decreased with higher eccentricity accord-111

Preprint Submitted for review / Computers & Graphics (2021)

Algorithm used	Defenences	Static	Dyna	Dynamic		eline
Algorithin used	References		Eye-	Gaze-	Ray-	Raster-
			tracker	tracker	based	based
Gaze-contingent occlusion	Mantiuk and Janus [144]					
Screen space ambient occlu-	Mantiuk [143]				1	
sion						
Coarse pixel shader	Vaidyanathan et al. [225], He et al.			Virt.		
	[82], Xiao et al. [248]					
Coarse pixel shader	Patney et al. [173, 172]					
Multi-rate shader	Stengel et al. [203]					
Pixel shader degradation	Duchowski et al. [60]			Mouse		
Gaze-contingent pixel shader	Bektas et al. [27]					
Gaze-contingent pixel shader	Bektas et al. [27]					

Table 5. List of different shading simplification techniques; similar techniques have been clustered together.

 $Virt. = virtual \ camera$ 

ing to the CSF.

Adjusting the number of samples has then been gener-2 alized to control variable shading rates (VRS) in a GPU pipeline. In their seminal study, Vaidyanathan et al. [225] introduced the first coarse pixel shader (CPS), derived from multi-sample anti-aliasing (MSAA) [5]. Generally, MSAA uses a fixed number of visible samples; however, the CPS allows predefined varied shading samples across the 8 image. As a result, the number of shading computations on the shaded quads saved is about 50% than Guenter et 10 al. [80]. Similarly, Patney et al. [173] apply variable-rate 11 shading at different resolutions which enable coarse render-12 ing after 0° eccentricity. In addition to shading reduction, 13 one shader for each pixel-block, blur mask, contrast 14 enhancement, and temporal anti-aliasing (TAA) is used to 15 discard peripheral visual artifacts. As an improvement, 16 this approach decreases the shading rate by up to 70% in 17 comparison to Guenter et al. [80]. Furthermore, Patney et 18 al. [172] demonstrate a set of perceptual-based methods to 19 enhance immersion experience and alleviate the computa-20 tional burden of VR using MSAA to ensure temporal 21 stability in foveated rendering. He et al. [82] demonstrated 22 that simple pipeline mechanisms present in programmable 23 GPU hardware used in conjunction with adaptive shad-24 ing techniques that select whether to use coarse or 25 fine fragments for shading can reduce the cost of shading 26 during rendering by at least a factor of two in most bench-27 marks. More complex pipeline scheduling enables using 28 even coarser fragments (up to groups of pixels, re-29 ducing shading costs, on average, to more than three and 30 sometimes up to a factor of five. Nowadays, VRS [205] is 31 now a hardware-implemented solution available in graph-32 ics pipelines. For instance, the Turing architecture from 33 NVIDIA combines VRS [205] with adaptive resolutions 34 [29] to speed-up rendering. This approach can be exploited 35 in foveated rendering by decreasing the shading rate in the 36 periphery through perceptually guided measures [82]. 37

The above decoupled sampling techniques, such as coarse pixel shading, is that they reduce costs by lowering the shading rate while resolving visibility at the full resolution, thereby preserving details along geometric edges. This is a major advantage with respect to several of the 42 sparse visibility sampling methods of Sec. 5 or the geo-43 metric simplification techniques of Sec. 6. However, loss of 44 texture details can produce visible blocking artifacts and 45 temporal jittering in the periphery. For this reason, Xiao 46 et al. [248] propose to combine coarse shading temporal 47 supersampling, i.e., jittering frames and combining sam-48 ples from multiple frames together. While not originally 49 applied to foveation, this method is at the basis of sev-50 eral spatio-temporal techniques (Sec. 8). Stengel et al. 51 [203] generalized the concept of multirate shading by in-52 corporating shading rate adaptation in a flexible GPU de-53 *ferred rasterization*. In their approach, several properties 54 of the sampling scene are accumulated in buffers during 55 the geometry pass. These include, in addition to the usual 56 depth, normal, and material information, also velocity and 57 semantic information. A perceptual pass combines an acu-58 ity falloff function with several other hints, such as eye 59 motion, texture adaptation, silhouette, eye adaptation to 60 luminance, to produce a sampling probability map, from 61 which a sparse sampling pattern is generated. The pat-62 tern is stored in the depth buffer, and early-depth is used 63 to stop processing unselected fragments. The final images 64 are produced by applying an inpainting process. This ap-65 proach is very general and has been shown to decrease the 66 number of shaded fragments by 50%-80% in comparison 67 to the prior works (e.g., [225, 82, 80]). 68

### 7.1.2. Discussion

Shader simplification is an extremely effective technique 70 to reduce the overall cost of rendering on high-resolution 71 displays since the pixel shader is often the dominant factor. 72 Modern shader simplification performs coarse rendering in 73 the periphery with either stochastic sampling and inpaint-74 ing [203], or reduced shading rate [82] followed by advanced 75 filtering [173, 172]. The implementation of gaze-dependent 76 shader optimization has been simplified with the intro-77 duction of CPS and VRS as common features in modern 78 GPUs, such as NVIDIA Turing and Intel Gen 11 architec-79 tures. Specialized solutions need; however, to be devised 80 to aggressively apply CPS in a foveation setting. First, 81

since CPS is unmatched with the visible samples, jittering 1 and flickering are frequently generated in the overly sim-2 plified area at the periphery of foveated renderings. These 3 dynamic artifacts are known to be visible and require the 4 application of strong temporal-anti-aliasing methods. Sec-5 ond, the rendered scene has lower shading quality in the 6 disoccluded regions, especially as it is more visible during 7 fast motion or dynamic shading. 8

### 9 7.2. Chromatic degradation

Achromatic (luminance) spatial acuity in the HVS is 10 known to be better than chromatic spatial acuity [161]. 11 12 Video and image codecs have exploited this fact by separating signals into luma and chroma components and re-13 ducing the amount of color information in a signal in fa-14 vor of luminance data [246]. Color sensitivity also rapidly 15 decreases in the peripheral region like any other type of 16 visual stimuli. It is thus possible to perform chromatic 17 degradation in the non-focal areas without negatively af-18 fecting the perceptual quality of the images. This process 19 can be exploited to, e.g., to perform gaze-dependent tone 20 mapping or reduce the required bandwidth for the storage 21 and transmission of images, especially high dynamic range 22 ones. 23

This section comprises different techniques developed for
chromatic degradation in the periphery. Table 6 lists several techniques used for chromatic degradation.

#### 27 7.2.1. Methods

As for shading simplification, there is not a sharp difference between ray-based and raster-based techniques, since chromatic degradation happens at the level of color computation.

Several works in these areas are centered around user 32 studies to find the tolerable color degradation in the pe-33 riphery. Among other techniques, Zhang et al. [259] 34 develop a peripheral color tolerance model based on the 35 CIE2000 color difference formula. In this technique, the 36 individual chromatic discrimination models at parafovea 37 and periphery are stored in a look-up table for future use. 38 Duchowski et al. [59] develop color degradation maps by 39 assigning each pixel's gray value to its corresponding con-40 tour value. Apart from the original resolution degradation 41 model, Watson et al. [235] also use chromaticity degra-42 dation by applying grayscale in the periphery. Bektas et 43 al. [27] apply modified *color degradation mask* developed 44 by Duchowski et al. [59], and integrate it in a general 45 gaze-dependent framework for testing user performance on 46 visual analysis tasks. 47

In one of the earlier studies on chromatic degradation, 48 Sakurai et al. [194] investigate color zone map, in which 49 each zone has three primary colors, and unique hue compo-50 nents that correspond to temporal, upper nasal, and lower 51 *directions* in the visual field. One most striking finding is 52 that, with eccentricity, the hue changes and saturation of 53 unique hue components decreases. Likewise, the hue reso-54 *lution* also can be defined by the total number of gray lev-55 els within each RGB channel. Correspondingly, Liu and 56

Hua [132] design spatial CSF-based chromatic foveation 57 mask, and hue resolution foveation metric. Interestingly, 58 this method has been shown to save bandwidth over 65% 59 in image transmission. 60

When dealing with colors, it is important to note that tone mapping has to be used used for reproducing high dynamic range (HDR) colors coming out of the rendering pipeline to the color gamut of the display. Knowledge of gaze information has been shown to be important to improve this process. As noted in Sec. 3.8, the HVS is always slowly adapting to a target luminance measured in a cone of approximately 1 degree around the gaze direction. The gaze is; however, not static, but follows saccadic motions. Mikami et al. [157] introduced a gaze-dependent approach based on a parameterization of Reinhard's photographic operator. They measure the local adaptation luminance by examining ROIs of  $^{\circ}$   $^{\circ}$ , and  $0^{\circ}$  around the viewing angles, and take as the final adaptation luminance the logarithmic average from the original compression equation. Experimental results demonstrated, however, that the results are very scene-dependent [252].

Mantiuk and Markowski [146] generalized this concept 78 by proposing a gaze-dependent *global tone mapping* for 79 HDR images. In their approach, for every pixel in the in-80 put HDR image, which may be the output of a complex 81 rendering process, a map of the background adaptation 82 luminance is computed. This is done in a GPU shader 83 that analyzes a one-degree area around each pixel and de-84 fines the local adaptation luminance to the most frequent 85 quantized luminance value in that area. This work is done 86 only when the rendered image changes. At each frame, the 87 gaze direction is captured, filtered, and used to compute 88 the temporary adaptation luminance, which combines the 89 fetched background adaptation luminance with the previ-90 ous temporary adaptation luminance using an exponen-91 tial function. The model describes adaptation to light, 92 e.g., when the observer moves his gaze from dark areas 93 to bright areas of the display. This adaptation luminance 94 is then used to compute the tone compression curve and 95 compress the HDR image. The work was later extended to videos [142]. In this latter work, to avoid the artifacts, ocu-97 lar Modulation Transfer Function [52] in linear luminance, 98 and two Gaussian pooling filters in the nonlinear domain 99 have been applied. Similarly, in a user study, Mauderer 100 et al. [152] gradually degrade color using tone mapping 101 to see the color discrimination effect in the periphery. Al-102 though this method improves color discrimination, the low 103 eye-tracking frequency may generate flickering effects. 104

#### 7.2.2. Discussion

While early methods, and many current works, study color degradation in the context of psychophysical testing, more recent work has started to exploit it for optimization purposes. The first area of interest is bandwidth reduction (e.g., [132]), which takes into account that lossy compression models can use gaze-dependent color sensitivity information to optimally allocate bitrates across a

105

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

Preprint Submitted for review / Computers & Graphics (2021)

Algorithm used	Defenences	Static	Static Dynamic		Pipe	eline
Algorithm used	References		Eye-	Gaze-	Ray-	Raster-
			$\operatorname{tracker}$	tracker	based	based
Adaptive tone mapping	Mikami et al. [157], Yamauchi et					
	al. [252], Mauderer et al. [152], Man-				/	
	tiuk [146, 142]					
Color zone mapping	Duchowski et al. [59]					
Color zone mapping	Sakurai et al. [194]					
Color tolerance model	Zhang et al. [259]					
Gray scale increment	Watson et al. [235]			Mouse		
Degradation color mask	Bektas et al. [27]			Mouse		
Spatial chromatic mask	Liu and Hua [132]			,		

Table 6. List of different chromatic degradation techniques, similar techniques have been clustered together

viewed image. The second area of interest emerging is tone 1 mapping which, in the most general case, must definitely 2 be gaze-dependent. While research has mostly targeted 3 the gaze-dependent presentation of HDR content (e.g., [146, 142, 152]), such information can also be exploited to 5 avoid intensive computation by combining it with shader 6 simplification (see Sec. 7.1).

#### 8. Spatio-temporal deterioration

The final and *fourth group* of techniques in our classification (Figure 5) strives to improve performance by adapt-10 ing the refresh rate of pixels across the image, eventually 11 reusing information from previous frames for the less im-12 portant pixels. 13

Spatio-temporal deterioration is a feature found in many 14 real-time, multi-rate, and multipass rendering algorithms, 15 as it strives to amortize rendering costs over multiple 16 frames. In foveated rendering, these techniques need to 17 be suitably updated, as they need to take into account the 18 temporal sensitivity in the foveal region, in the periphery, 19 or both. 20

#### 8.1. Methods 21

Temporal coherence strives to reuse the intermediate or 22 final information computed during the course of one frame 23 to speed-up the rendering of the following frames. As such, 24 it complements the previously seen approaches, that fo-25 cus on improving the performance of individual rendering 26 tasks, eventually by lowering the accuracy at which one 27 frame is computed. This general approach dates from the 28 early days of graphics [208], and has led to a wide variety 29 of approaches [196]. 30

Foveated rendering has also used spatio-temporal dete-31 rioration approaches since its early days as a component 32 of many frameworks. Dorr et al. [56] were among the first 33 to present a gaze-contingent system capable of modulat-34 ing the spatio-temporal contents of a high-resolution real-35 time video, but adapting the spatial multiresolution pyra-36 mid of previous approaches [72, 174] to a temporal pyra-37 mid. Moreover, several early peripheral pixel reduction 38

methods (e.g., [80, 63]) applied a combination of motioncompensated temporal reprojection [79] and temporal jitter on a spatial sampling grid [49] to decrease frame times by recomputing a smaller number of pixel per frame in the periphery (Sec. 5.4). Since then, a wide variety of foveated spatio-temporal solutions were integrated in both ray-casting and rasterization pipelines.

Several approaches adapt classic optimizations, such as amortized supersampling [254, 248] an reprojection caches [165]. Weier et al. [243] presented a foveated realtime ray tracer combined foreated rendering based on dynamic eye tracking with reprojection rendering using previous frames to drastically reduce the number of new im-51 age samples per frame. A smooth image is then gener-52 ated by combining these sparse samples with data coming 53 from previous frames. First, a coarse depth mesh is reconstructed from the previous frame samples, and a coarse image is rendered from the current frame perspective. Then the parts of the image that are considered not valid due to occlusions/disocclusions/missing data or poor reprojections are identified. This is done by detecting if there is a depth or luminance difference between a current frame's pixel and its direct neighborhood in the reprojected image that is larger than a user-defined threshold or if the pixel is on a silhouette edge. Finally, the high-resolution image is generated, reusing reprojected pixels from the previous frame whenever possible, and recomputing invalid pixels by ray-tracing. Reflections and refractions are reasonably well handled if present in small areas of the image, since those pixels are likely to be recomputed. Moving lights, however, tend to drastically degrade performance.

Franke et al. [65] used similar approaches in a raster-70 ization pipeline. Since in rasterization redrawing single 71 pixels cannot be done efficiently, their focus is to devise ap-72 proaches to reduce expensive redrawing operations with-73 out visible impact on image quality. In their approach, 74 the last frame's color and world position images are re-75 projected into the current frame and hole-filled using a 76 push-pull filter [203]. A confidence map is then derived 77 by combining an eccentricity confidence factor, based on 78 the falloff in the eye's visual acuity with two factors that 79 measure the confidence in hole-filling result. The first fac-80

39

40

41

42

43

44

45

46

47

48

49

50

54

55

56

57

58

59

60

61

62

63

64

65

66

67

68

Preprint Submitted for review / Computers & Graphics (2021)

Almonithms used	D - f	Static Dynamic		amic	Pipeline	
Algorithin used	References		Eye-	Gaze-	Ray-	Raster-
			tracker	$\operatorname{tracker}$	based	based
Temporal raytracing	Weier et al. [243]					
Temporal pyramid	Dorr et al. [56]					
Time-warped rendering	Linus et al. [65]					
Spatio-temporal filtering	Jiang et al. [97]					
Temporal supersampling	Xiao et al. $[248]$					

tor is inversely proportional to contrast, while the second 1 is inversely proportional to the hole size. Moving objects 2 are handled by lowering confidence of pixels where object 3 motion is detected. All pixels whose confidence is below a Δ given threshold are then redrawn. This is done by redrawing the scene, culling out objects that are totally covered by high-confidence pixels. Before displaying the final image, a TAA and motion smoothing pass is applied. The 8 method proves very efficient, but is less capable to handle 9 transparency and reflection than the fine-grained raytrac-10 ing approach [243], while still being incapable to efficiently 11 support moving lights. 12

#### 8.2. Discussion 13

One of the main problems in adopting temporal degra-14 dation methods is that, unlike the spatial resolution as a 15 function of eccentricity, the peripheral temporal charac-16 teristics of the HVS are still not totally understood [56]. 17 This makes it difficult to have reliable models that pre-18 dict the effect of spatio-temporal degradation. Recently, 19 Krajanciche et al. [120] proposed the first experimentally 20 derived comprehensive model for spatio-temporal aspects 21 over the retina under conditions close to VR applications. 22 It is interesting to note that temporal sensitivity has been 23 observed to peak in the periphery, somewhere between 24  $0^{\circ}$  eccentricity [224, 120]. This means that foreated  $0^{\circ}$ 25 rendering solutions cannot limit themselves to just focus 26 on providing high-quality rendering for the fovea, spend-27 ing as little resources as possible in the periphery, but 28 should also combat peripheral flickering. While those ef-29 fects can be significantly amortized by spatiotemporal fil-30 tering [80, 63, 248, 97], these solutions are only partial, 31 as they tend to overly reduce local contrast. Loss of con-32 trast in a large area of the periphery region can result in 33 tunnel vision artifacts [39]. For this reason, other authors 34 have tried, with variable success, to produce flicker-control 35 schemes that strive to preserve contrast [173, 97]. An im-36 portant consideration to make is that the sensitivity to 37 temporal artifacts also depends on fixation types. Weier 38 et al. [243], for instance, noted that fewer visual artifacts 39 were noticed when users concentrated their attention on 40 a moving target, a fact that could be exploited in future 41 work. Further considerations are presented in Sec. 10.1. 42

#### 9. Applications

Foveated rendering may be viewed as a general opti-44 mization technique, which could be applied to any use 45 case in which interactive images are presented to view-46 ers. Nonetheless, in the past years, foveation has been ap-47 plied more extensively in a few selected areas that we have 48 broadly classified into visualization (Sec. 9.1), compres-49 sion (Sec. 9.2), and transmission (Sec. 9.3). Compression 50 and transmission are included here as they offer enabling 51 technology for remote rendering and collaboration, and, 52 for maximum efficiency, end-to-end systems require a care-53 ful integration of all components. Table 8 distributes the 54 surveyed literature among these selected areas. 55

43

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

### 9.1. Foveated visualization

In this application class, we broadly classify all situations in which the main application of foveation is to visualize data, either to improve application performance or to display some effects to emulate particular viewing conditions.

#### 9.1.1. Immersive visualization

According to Cuervo et al. [51], three parameters are essential for a truly immersive virtual experience: quality, responsiveness, and mobility. The quality guarantees natural and real-world visual experience, responsiveness represents rapid visual feedback to motion, and *mobility* allows moving unterhered in physical space. Park et al. [169] also suggest that a display requires high resolution without screen door effects, wide FOV, high frame rate without motion artifact, and minimum tolerable latency for an immersive experience. Similarly, Fujita and Harada [69] report fast, low-latency, smooth, and realistic rendering methods are crucial for immersion. Weier et al. [243] support this statement by exploring the necessity of high frame rate, and low latency.

The higher demand on pixel density along with the 77 stereo display increases the complexity of the real-time 78 rendering process, making foveated rendering very appeal-79 ing. With the emergence of robust eve-trackers that al-80 low individual vision, immersive VR has now been consid-81 ered the main application domain of foveated rendering. 82 Seminal foveated rendering research for immersive expe-83 rience are based on adaptive sampling [80, 243, 69, 156], 84

35

36

37

38

39

40

41

42

43

44

45

46

47

48

49

50

51

52

53

54

55

56

57

58

59

60

61

62

63

64

65

66

67

68

Foveated visualization	Application in visualization (Sec. 9.1)	Foveated compression (Sec. 9.2)	Foveated transmission (Sec. 9.3)
Adaptive resolution (Sec. 5)	$ \begin{bmatrix} 127, 235, 174, 24, 23, 227, 77, 176, 3, 34, 78, \\ 199, 260, 80, 63, 69, 201, 177, 27, 28, 209, 179, \\ 180, 243, 85, 139, 123, 115, 116, 242, 156, 213, \\ 100, 84, 226, 148, 214, 103, 169, 238, 68, 154, \\ 36, 223, 110, 200, 117, 155, 247, 10, 256, 140, \\ 253, 18, 175 \end{bmatrix} $	[72, 42, 198, 90, 106, 255]	$\begin{bmatrix} 72, \ 258, \ 2, \ 158, \ 113, \\ 138, \ 51, \ 92, \ 93, \ 189, \\ 109, \ 156, \ 154, \ 169, \ 67, \\ 211, \ 155, \ 94, \ 128 \end{bmatrix}$
Geometric simplification (Sec. 6)	[70, 167, 149, 137, 137, 136, 162, 184, 44, 170, 236, 163, 168, 241, 240, 195, 131, 262, 219]		[168, 195]
Shading simplification and chromatic degradation (Sec. 7)	[164, 60, 144, 225, 82, 27, 192, 173, 172, 143, 248] [235, 194, 59, 145, 69, 27, 259, 152, 142]	[132]	[203]
Spatio-temporal deterioration (Sec. 8)	[80, 63, 56, 243, 248, 97, 65]		

Table 8. Different application domains of foveated rendering, most of the research engage in rendering and visualization. Compression and transmission are included as they offer enabling technology for remote rendering and collaboration, and, for maximum efficiency, end-to-end systems require a careful integration of all components.

coarse pixel shading [225, 82, 173, 172], rolling rasteriza-1 tion [68], and contrast aware foreation [223]. Due to peripheral degradation, immersion is not free from flickering, and a strong anti-aliasing algorithm is required. There is another downside of conventional VR displays. Because of 5 the flat surface, the vergence and accommodation conflict stops the foveated window from acquiring accurate depth information. However, the modern near-eye displays, e.g., holographic, varifocal, and light field can overcome this drawback, which will increase the level of immersion, but 10 with higher computation. In a recent review on near-eye 11 holographic display, Chang et al. [45] concisely explore the 12 potentiality of foveated rendering in holographic displays. 13 According to the authors, foveated rendering is possible 14 either with multiple display panels or on rendering tech-15 nique. The potential rendering approaches can be point 16 cloud [84, 100], polygon mesh [103] and multi-plane mod-17 els [139, 41, 123]. Besides, Chang et al. [41] recommend 18 that the first two approaches rely on complicated geometry 19 and computer graphics processing. Nonetheless, the *multi*-20 plane model is much simpler and more efficient, in which 21 the 3D scene is rendered as multiple planar 2D images. 22

#### 23 9.1.2. Volumetric visualization

Volumetric data visualization has become more common 24 nowadays due to the advances in 3D data acquisition and 25 complex simulations on modern displays with an interac-26 tive framerate. Due to the enormous complexity of semi-27 transparent volume rendering, which requires the compu-28 tation of integrals per pixel, maintaining interactive per-29 formance is very hard, and much research has focused on 30 volume-specific optimization techniques [19, 32]. In this 31 context, foveation promises to be extremely effective, as 32 it can drastically reduce both the number of pixels for 33 which to compute these integrals and the quality at which 34

they need to be computed. For this reason, many applications have been studied. Among the various outstanding foveated volumetric rendering methods it is important to mention applications to importance-driven medical data visualization [227], arbitrary geometric object visualization [163], large scale geometric dataset interaction [136], general volume data visualization [36], depth peeling-based data visualization [260], and large scale scientific data visualization [10]. Foveated volumetric approaches have also been introduced over 15 years ago in the context of remote visualization (e.g., [258, 176]).

#### 9.1.3. Large-scale visualization

Many important application domains, including 3D scanning, computer-aided design, and numerical simulation, require the interactive inspection of extremely massive models. Despite the continuing and rapid improvement in GPU hardware performance, the interactive rendering of these models using brute force techniques continues largely overloading state-of-the-art hardware platforms. For this reason, researchers have devised a variety of adaptive techniques for rendering approximate representations, filtering out as efficiently as possible the data that is not contributing to a particular image [257]. Foreation promises to be extremely effective in this context. For this reason, for a variety was used very early on for a variety of massive-model rendering use cases in a variety of configurations. These include foveated terrain rendering on very large high-resolution displays [184, 195], visualization of voxel data on tiled displays [241, 240, 192], focus-andcontext visualization and large image data visualization on multi-projector systems [3, 27, 26], projection display of cultural heritage artifacts [77, 78], as well as information visualization on large high-resolution displays [13] visualize large scale information.

24

Preprint Submitted for review / Computers & Graphics (2021)

### <sup>1</sup> 9.1.4. Vision defection mapping

Nowadays, a large population suffers from vision de-2 fects like myopia, hyperopia, glaucoma, presbyopia, and 3 astigmatism. Therefore, considering the space-variant vi-4 sion characteristics, an accurate simulation of an individ-5 ual's visual field can educate students, patients, and family 6 members about the perceptual defects. Foreated rendering methods are the basic enabling technology for this ap-8 plication use-case. Perry and Geisler [174, 73] design a 9 multi-resolution pyramid based vision simulation frame-10 work that can visualize the resolution map of a glaucoma 11 patient. In the same way, Labhishetty et al. [121] inves-12 tigate accommodation conflict on myopia patients. Inter-13 14 estingly, this study suggests that, unlike fovea and perifovea, the *parafovea to higher eccentricity* is affected by 15 myopia. Since rendering the resolution of non-foveal simu-16 lations can affect user accommodation, the authors suggest 17 considering foveated rendering algorithms for such medi-18 cal conditions. Fridman et al. [66] simulate observer vi-19 sion with gaze point. Likewise, Deza et al. [55] visualize 20 real-time *metameric image* using foveation. Correspond-21 ingly, Barsky [21] demonstrate computer-generated images 22 that incorporate the characteristics of an individual's en-23 tire optical system based on the optical wavefront aber-24 rometry measured using a Shack-Hartmann aberrometer. 25 In fact, this study can also be used for efficient interface 26 design, usability, safety, and behavioral evaluation. Re-27 cently, Wu and Kim [247] develop an AR display in which 28 a free-form image combiner allows embedding prescribed 29 lens to provide vision-corrected augmented object with an 30 optical see-through display. 31

#### 32 9.1.5. Preview systems

Several algorithms are too slow to fully produce full-33 quality, large FOV images at an interactive rate. Pro-34 gressive rendering has been employed for decades in this 35 situation to quickly provide coarse approximations to the 36 37 viewer in a very short time [74]. Foveated rendering can be very beneficial in this area, by concentrating image im-38 provements on areas that are currently viewed by the user. 39 Koskela et al. [115] use the first approach developing a 40 gaze-directed guided preview with the quadratic denomi-41 nator visual acuity model. In this algorithm, more rays are 42 generated around the ROIs using unidirectional path trac-43 ing. Unsurprisingly, this foveated preview system performs 44 ten times faster than the conventional uniform sampling 45  $0^{\circ}$  image area, with little degradation over the whole 46 with respect to uniform refinement [116]. 47

### 48 9.2. Foveated compression

In several situations, rendering applications must work
in a distributed setting. In that case, reducing the bandwidth of transmitted rendering images is particularly important. Foveation has been demonstrated to improve
compression by considering gaze in bit allocation methods.
Back in 1998, Geisler et al. [72] were among the first to advocate foveation for lossy video compression. Among the

few representatives of foveated compression techniques, 56 Sheikh et al. [198] developed gaze-contingent low-pass fil-57 tering on standard video compression algorithms (H.263) 58 and MPEG4). Likewise, Wilson and Jeffrey [72] designed 59 a multi-resolution *image compression* for low-bandwidth 60 communication. It has, however, been noted that consid-61 erable savings are obtained only by aggressively reducing 62 the quality outside the ROI, which can cause noticeable 63 artifacts in the periphery. More conservative applications 64 resolve these problems but provide only modest savings 65 with respect to non-foreated compression [172]. Nonethe-66 less, Frieß et al. [67] have successfully used this paradigm 67 by proposing different parameterized macroblocks based 68 on an H.264 encoder, considering an acuity fall-off. In their 69 approach, the hardware encoder and foveated encoders 70 have been merged to enable high-quality screen capture 71 between two displays over a standard Ethernet connection 72 (100-400 Mbps) for supporting remote collaborative visu-73 alization on large high-resolution displays with more than 74 44 megapixels. Recently, it has been demonstrated that 75 the quality limitation problems of standard transform en-76 coders may be overcome by deep learning approaches, in 77 which deep networks are trained to reconstruct peripheral 78 areas from very sparse samples [106]. These results are 79 extremely promising, especially in the context of emerging 80

 $0^{\circ}$  video formats [255]. As hardware-accelerated real-81 time video codecs integrated with GPUs have now become 82 an essential enabling technology for many real-time graph-83 ics applications running over the network, e.g., cloud gam-84 ing [197], it is expected that future foreated codecs would 85 be of even larger importance in VR settings [94]. For max-86 imum benefits, it is important to integrate compression 87 solutions with renderers, so as to avoid spending time on 88 pixels on which few bits will be allocated. 89

90

#### 9.3. Foveated transmission

Foveated transmission attempts to conserve bandwidth 91 by sending only detailed information in the ROIs and low-92 ering it to the periphery. Video transmission consumes 93 most of the bandwidth over the internet. For instance, in 94 2019, 72% of the total mobile data traffic has been used 95 for video transmission [138]. For this reason, much of the 96 work concerning foveation has concentrated on improv-97 ing general video transport for streaming services [193]. 98 In this context, notable video transmission methods de-99 signed to concentrated effort on the fovea and reduce it 100 in the periphery are gaze-dependent multimedia transmis-101 sion [138], log-polar transformation [156, 154, 155], log-102 rectilinear [128] transformation, gaze crop filter [189] and 103 likelihood-based foveation [51]. A notable result has been 104 presented by Kim et al. [109], who developed the first 105 foveated video player based on MPEG Dynamic Adap-106 tive Streaming (DASH) over HTTP and Spatial Relation-107 ship Description for high definition  $0^{\circ}$  video streaming. 108 In this approach, the scene is first subdivided into differ-109 ent regions. After the decoding of the regions, bit-stream 110 stitching and 3D texture mapping are applied. Finally, a 111

Preprint Submitted for review / Computers & Graphics (2021)

<sup>1</sup> multi-resolution rendering is used where the center view-

port is rendered with full resolution, four sides with 2 of the resolution. However, while the and corners with 3 authors claim that frame rates can be improved by 10%-4 15%, there is no solid evidence to back up this assertion. 5 Likewise, Rondon et al. [189] designed a client-server sys-6 tem based on *bilayer resolution* and MPEG-DASH principle that streams only high-resolution  $0^{\circ}$  videos over ROIs. In the implementation, generating a one-secondlong segment of 30 frames, server delay is approximately 10 700 ms per segment, or ca. 23 ms per frame, closer to 11 tolerable latency. 12

Since minimizing *end-to-end* latency and maximizing
refresh frequency and image quality is essential for VR.
Thus, foveated transmission is also becoming a basic
block for remote and collaborative interactive applications,
which require a very close cooperation between rendering
and transmission components.

In *remote visualization*, there are two techniques possi-19 ble: render local and render remote [30]. For the first ap-20 proach, the entire data volume is sent to the client device 21 for rendering which requires high bandwidth. Aside from 22 bandwidth, the requisite computation power is mostly un-23 available for many low-end devices (e.g., tablets, smart-24 phones). The second technique where data can be ren-25 dered at the server and then sent to the low-end devices, is 26 more robust in that case. With an additional gaze-tracker, 27 remote rendering has opened a whole new application do-28 main like *foveated cloud gaming*, that allows playing high-29 end games on low-end devices, where low system latency is 30 crucial [158, 92, 93, 46]. Illahi et al. [94] recently demon-31 strated that using a parameterized Foveated Video En-32 coding for real-time interaction in cloud gaming reduced 33 bandwidth up to 10%. 34

Through foveated rendering, large-scale collaborative 35 data visualization in a remote server has been demon-36 strated over standard bandwidth [258, 67]. In this context, 37 Papadopoulos and Kaufman [168] designed a 1.5 gigapix-38 els immersive display that can visualize both  $0^{\circ}$  videos 39 and a large scientific data set over an internet browser. In 40 addition to transmission, Syawaludin et al. [211] develop 41 a dual-camera setup for  $0^{\circ}$  video-based remote interac-42 tion. Among the two cameras, one is a pan-tilt-zoom cam-43 era, and another is an omnidirectional camera but with 44 the same frame rate. 45

For the interactive cap-46 ture and transmission of volumetric videos taking into ac-47 count special 3D display characteristics. In particular, the 48 data processing and transmission load for light field dis-49 plays require an exceedingly large bandwidth and compu-50 tation resources. Adhikarla et al. [2] developed the first 51 light field data compression algorithm for a telepresence 52 application on a large-scale light field display. The method 53 takes into account display geometry and viewer positioning 54 for discarding unused parts of the images from a camera 55 array in the acquisition site before transmission. For a 56 19 second footage, this compression used only 20% of the 57

whole data stream without introducing temporal or spatial artifacts. The approach was later extended to perform retargeting to different light field displays through adaptive depth range compression [113]. As the method generates a depth map, it can be used to combine both synthetic data and captured video. Thumuluri and Sharma [217] later designed a light field data reconstruction technique that claims faster data transmission.

10. Discussion

Foveated rendering has witnessed substantial progress in the past decades, growing from early methods aimed mainly at psycho-physical testings or proof-of-concept renderers to a variety of solutions for optimizing the rendering process in a variety of very demanding settings. Moreover, many of the proposed technical solutions have been used in a wide variety of realistic applications.

Our survey has provided an integrative view into this wide array of methods, highlighting the strengths and limitations that currently exist in the field. On the basis of this analysis, we provide a view of open problems and current and future works.

#### 10.1. Improving current foreated rendering techniques

Foveated rendering is a potentially a very effective approach to jointly optimize rendering fidelity, frame rate, compression, transmission, and power consumption by adaptively varying peripheral image quality. Many techniques have been proposed in the past, that we have classified into four main peripheral degradation categories (Sec. 5-8). While the survey clearly demonstrates large advances in each of these categories, various bottlenecks still exist, leaving large space for further research. This is due, in particular, to the fact that, in most situations, foveation provides significant benefits especially when the focus area is maintained as small as possible, and very aggressive simplifications are applied. Under these conditions, even the best available techniques are prone to introduce visible artifacts on non-trivial scenes.

Spatial artifacts due to insufficient density of rendered 95 images are an obvious outcome of foveated rendering ap-96 proaches, especially on several display kinds that strive 97 to offer a wide FOV coverage. For instance, maintain-98 ing high pixel density is crucial for minimizing stochastic 99 visual artifacts, especially for near-eye displays. For in-100 stance, it is now common to combine two displays, one 101 with high pixel density and another with low pixel den-102 sity a near-eye AR display that reduces both pixelation 103 and screen door effect (e.g., [213]). However, under even 104 moderate degrees of foveation, the low-pixel density dis-105 plays in the periphery often suffer from staircase artifacts 106 and motion aliasing (flickering). In addition, many other 107 spatial artifacts may arise from the individual techniques 108 employed to reduce rendering complexity. For instance, 109 spatial edges are often visible in between layers created 110 by the foveation [72], pupil swim effects may be the result 111

25

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

26

of techniques that decompose a 3D scene into 2D layers 1 heloing [123] and haloing and occlusion/disocclusion prob-2 lems may arise from adaptive sampling approaches [144]. 3 Moreover, temporal artifacts remain among the most com-4 mon problems arising in foreated rendering, independently 5 from the peripheral degradation technique employed. This 6 is because the HVS is particularly vulnerable to tempo-7 ral instability. In fact, peripheral vision is particularly 8 sensitive to contrast changes and movements as the rods 9 are highly concentrated at the periphery (maximum den-10 sity at about ° of the viewing direction) [65]. Periph-11 eral vision, like the fovea, is also essential for intuitively 12 perceiving the surroundings and reacting to changes and 13 movement. Moreover, when motion starts, for instance: 14 head rotation, eye movement, or animation, any visible 15 aliasing effects (e.g., a lower spatial resolution) can create 16 perceptible temporal artifacts, a.k.a., flickering. Surpris-17 ingly, the peripheral vision is more flicker sensitivity than 18 even stereoscopic depth perception [224, 8]. For this rea-19 son, flickering is possibly the most common visual artifact 20 in foveated rendering that often breaks the seamless vi-21 sual experience. A wide number of solutions have been 22 proposed to combat these problems, including blur map-23 ping [22, 106, 150], depth of field filters [242, 91], temporal 24 smoothing filters [36], phase-aligned rendering [25, 222], as 25 well as display designs that strive to eliminate illumination 26 variations [68]. All these solutions, though effective, have 27 their pros and cons. For instance, blur also diminishes 28 the local contrast [22, 106, 150]. This contrast reduction 29 may lead to further visual artifacts, such as screen-door 30 effect, pop-up effect, spatial-edge artifacts, temporal alias-31 ing (flickering), and pupil swim effect [172, 97]. Moreover, 32 temporal filters are also prone to contrast reduction and 33 not easy to combine with many of the adaptive rendering 34 techniques [118, 36, 155, 97]. 35

### <sup>36</sup> 10.2. Exploiting machine learning for foveated rendering

Efficient foveation techniques must quickly determine 37 the gaze point with the minimum latency and exploit it 38 to rapidly present a suitable approximation. This requires 39 not only advances in tracking and display hardware but 40 also advances in models for predicting eye motion to reduce 41 latency and for determining image approximations that 42 provide the best quality within the available resource bud-43 get. While many first-principle solutions have been pro-44 posed with various degrees of success (see Sec. 5-8)), one 45 of the emerging research directions is to learn these mod-46 els from examples (see Table 9). Replacing or augmenting 47 trackers with an accurate gaze prediction model can reduce 48 both computing complexity and latency (see Section 3.5). 49 Research in this area is only starting. For instance, Lemley 50 et al. [125] attempted to predict eye-motion through CNN 51 architectures trained on the PoG dataset [153], and later 52 improved the approach using use an *appearance-based CNN* 53 model [126] on MPII-Gaze dataset [261]. Arabadzhiyska 54 et al. [14] present another end-to-end amplitude-based 55 user-specific saccade prediction model; however, two user 56

experiments prove that the user-specific model predicts 57 better saccade landing prediction than the general observer 58 model, highlighting the difficulty of devising general ap-59 proaches. Similarly, Mohammed and Staadt [159] model 60 multi-LCD high-resolution disgaze-movements on a 61 play with two reinforcement learning models, training and 62 testing them on the Microsoft Salient Object dataset [133], 63 and York University Eye Fixation dataset [35]. These ap-64 proaches show the interests of the approach, but also high-65 light that current solutions are not robust to user-specific, 66 and display-specific. 67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

Learning techniques are also starting to deliver results also in the area of rendering. In particular, Fridman et al. [66] developed the first Foveated Generative Network and an online tool, SideEye for peripheral vision simulation, and Deza and Jonnalagadda [55] proposed another deep learning-based framework to construct visual metamers NeuroFovea in real-time. Moreover, Kaplanyan et al. [106] explored the usage of generative adversarial neural networks to reconstruct a plausible peripheral video from a small fraction of pixels provided every frame. The method, fast enough to drive gaze-contingent head-mounted displays in real-time on modern hardware, is shown capable to produce visual experiences with no noticeable quality degradation using only 10% of the pixels. Likewise, Thumuluri and Sharma [217] designed generative adversarial neural networks for light-field reconstruction, also using 10 times less light field data than the existing state-of-the-art work.

These early results show that the use of machine learning to improve foveated rendering is a promising but still not a fully explored research domain. Matthews et al. [150] suggest that, in general, multi-rate shading is not restricted to foveation and can be robustly implemented using a neural network model. However, among the existing research challenges is the relative shortfall of training databases, which are not easy to synthesize.

#### 10.3. Supporting multiple users

Foveated rendering is a view-dependent rendering optimization technique, and foveated algorithms are typically designed for single-view only. The near-eye and headmounted displays are the most convenient for this intent. However, in several situations, multiple users can simultaneously watch a display, and single-user techniques are not directly applicable.

Regular small-sized displays makes it very difficult to 102 take advantage of multiview foveation, since, in case of 103 multiple users, much of the area of the display would be in 104 focus. Even for large high-resolution displays, viewers are 105 most of the time confined to the presenter's vision [195, 106 241, 240], and per-user foreation is still rare [65]. The 107 increase in size and resolution of display surfaces, often 108 combined with touch interfaces, and the need for remote 109 and co-located collaboration makes multi-user foveation a 110 very appealing alternative [67], and can be identified as a 111 very interesting area for future research. 112

#### Preprint Submitted for review / Computers & Graphics (2021)

34

35

36

37

38

39

40

41

42

43

44

45

46

47

48

49

50

51

52

53

54

55

56

57

58

59

60

61

62

63

64

65

Refer-	Platform	Applications	Technique	Database
ence				
[125]	AR/VR	Gaze prediction	Generative adversarial networks	PoG dataset [153]
[126]	AR/VR	Gaze prediction	CNN	MPII-Gaze dataset [261]
[159]	LHRD	User gaze model	MaxEntropyIRL, FIRL	MS Salient Object [133], York University Eye Fixation dataset [35]
[14]	Desktop	Saccade landing pre- diction	Parameterize amplitude model	In-house dataset
[106]	VR/Desktop	Video reconstruction	Generative adversarial- NN	YouTube-8M [1]
[217]	Light field display	Foveated reconstruc- tion and view synthesis	Convolutional Neural Net- work	DeepFocus [249]
[4]	Desktop	Object detection	HOG feature, latent- SVM-like framework	PASCAL VOC 2007 [62]
[66]	Desktop	Peripheral vision simu- lator	generative-NN	Places dataset [263]
[55]	Desktop	Visual metamers simu- lation	Deep learning	In-house dataset

Table 9. Notable foveated machine learning approaches, relevant platforms, applications, and used database.

Non-conventional displays, which typically require much 1 effort per pixel, are also offering important research oppor-2 tunities. For instance, a light field display allows multiple users to watch a single scene from different perspectives, and, as noted by Spjuit et al. [102], efficient multi-user foveation is essential to avoid the computation of the very 6 large number of rays not directed towards a viewer. Developing scalable and efficient techniques in these cases requires considerable research and engineering efforts, comq bining precise multi-user tracking with scalable, and of-10 ten display-specific, low-latency parallel rendering meth-11 ods taking into account foveation. 12

### <sup>13</sup> 10.4. Evaluating the visual quality of foveated rendering

The advancement in foveation technology cannot be dis-14 joint from advancements in methods for evaluating the 15 visual quality of results. With foveated rendering, the 16 graphics quality should be persistent and acceptable re-17 gardless of application specifications. While several efforts 18 have been targeting evaluation, no consistent and standard 19 evaluation method yet for assessing the foreated rendering 20 quality, both subjectively or objectively. 21

Subjective evaluation is, in principle, very appealing, 22 since it directly considers humans as the end-user of 23 a graphics output [80, 173, 210]. However, it is also 24 framework-based, scene-dependent, and observer-biased. 25 Moreover, it is time- and resource-consuming, since the re-26 sulting scores need to be calculated from a decent amount 27 of observers over multiple viewing sessions in which the 28 observers confirm the foveated rendering is impercepti-29 ble than perceptible. A few authors have also suggested 30 other qualitative measures than the pure ability to perceive 31 or not variations, such as *efficiency* and *consistency* [88]. 32 The *efficiency* of an experiment defines how quickly the 33

perceptual ratio will converge with higher performance and lower experiment costs, such as shorter assessment time or fewer judgments. *Consistency*, on the other hand, seeks to assess the firmness of individual Quality of Experience (QoE) ratings. Only a few studies allow wearing eyeglasses during the evaluation [9]. There are also several testing approaches and statistical models used in the literature to evaluate qualitative result, such as 2AFC [223, 184, 65], MOS [138, 238, 219, 144, 143], ANOVA [27, 243, 152, 59, 9, 182, 235, 163], T-test [207], pairwise [163], and chi-square. Few other studies, such as [163, 243, 111] use multiple statistical models to validate their algorithms.

Objective evaluation based on quantitative measurements is often preferred by researchers because, the incorporation of models that predict outcomes for humans, leads to simpler ways to use the outcomes of the evaluation to drive adaptive methods. However, due to spacevariant nature, the traditional perception-based graphics quality matrices [130] is debilitated in foreated render-A few research use conventional graphics quality ing. metrics [40], e.g., SSIM [68, 169], DSSIM [154], PSNR [225, 169], but measure the foveal and peripheral graphics quality separately. Others, attempt to consider foreationspecific measures, for instance, the foveated wavelet image quality metric [230], that considers the spatial variance of CSF, local visual cut-off frequency, the Foveal Signal to Noise Ratio (FSNR), and Foveal Weight Signal to Noise Ratio (FWSNR), that consider the distortion visibility decrement in the periphery [124], and the Foveated Point Signal to Noise (FPSN) and Foveated Image Quality (FIQ) metrics for holographic displays [123].

Other authors have also proposed to adapt *full-reference* 666 image quality metrics to foveated rendering. For instance, 677

28

Tsai and Liu [220] sub-divides the scene into different win-1 dow sizes, measures window scores using traditional and 2 pool the scores together for an overall performance re-3 port. Other authors extend the the acuity fall-off model 4 to compute foveated variations on standard scores, such 5 as Foveated Mean Squared Error (FMSE) [188], Foveation 6 Adaptive Root Mean Squared Error (FARMSE) [228], or the FLIP perceptual metric [12]. Noteworthy, such full-8 reference graphics quality evaluation is impractical due 9 to the relative lack of reference in the graphics rendering 10 process. Recently Mantiuk et al. [147] proposed a full-11 reference visual quality difference metric, FovVideoVDP. 12 The metric can predict visual differences for different types 13 of distortions: blur, JPEG compression, flicker, and Gaus-14 sian additive noise at different eccentricity levels, tested 15 on rendering dataset, FOVDOTS. This metric is more ef-16 ficient for higher FOV displays, such as AR/VR displays. 17 However, color, glare, inter-channel masking, and eye mo-18 tion were not included in the model, which requires further 19 analysis. 20

Chen et al. [98] created the first compressed  $0^{\circ}$  video 21 database, LIVE-FRL that can be used for foveated image 22 and video quality assessment. This database consists of 23 190 videos with 8K quality, including 10 reference videos 24 and 180 distorted or foveated videos which are also gener-25 ated from the reference videos. Moreover, Jin et al. [99] 26 published a study on both subjective and objective qual-27 ity assessment of VR video compression, along with a 2D 28 and stereo 3D video database. The complexity of foveated 29 rendering quality evaluation and the high sensitivity to 30 display and tracking characteristics makes it a very active 31 research direction [210]. 32

# 10.5. Studying the effects of foveation artifacts on user performance

While, ideally, the goal of foveation is to produce images 35 indistinguishable from non-foveated ones, in practice some 36 artifacts may appear in the rendered images. These arti-37 facts may result from imperfections in tracking or displays, 38 delays in various stages of the pipeline, or approximations 39 in rendering methods or guiding metrics. Moreover, even 40 in the case in which imperceptible images could be gen-41 erated, it is often useful for applications to have the op-42 portunity to trade image quality with speed, to come for 43 massive/complex models or vary spatiotemporal realism 44 depending on tasks. 45

A large set of studies in cognitive psychology have iden-46 tified two interrelated classes of visual processing, referred 47 to as *preattentive* and *attentive* vision, respectively [87]. 48 In this model, preattentive vision scans large areas not-49 ing features that represent changes in pattern or motion. 50 These features include color, size, luminance, motion, pat-51 terns, shape, orientation, curvature but not closure, gaps, 52 or terminators. Attentive visual processes refer, instead, to 53 processes required to recognize details about objects and 54 relationships in scenes. In an early study, Watson et al. 55 [232] suggest that, due to these human visual system char-56 acteristics, dynamic LOD control has to be content and 57

task-dependent. As a result, during operations such as vi-58 sual search, the observer necessitates more global visual 59 information, leading to less foveation. Multiple studies 60 have, thus, studied various forms of degradation during 61 visual search tasks, to find how imperfect foreated dis-62 plays affect visual performance. Other authors have con-63 centrated their efforts on finding good central area sizes 64 in which models have to be rendered at full resolution for 65 gaze-contingent displays. Results vary from as large as around  $0^{\circ}$  [163] to less than  $^{\circ}$  [26, 134] depending on 67 the display, frequency of update, and image content. The 68 same experiments performed on a desktop monitor and a 69 near-eye VR display also show a wide variation (e.g., from 70  $^{\circ}$ -  $^{\circ}$  for the monitor to  $0^{\circ}$  for the near-eye VR display). 71 As noted very early by Watson et al. [233], however, view-72 ers are more sensitive to how degraded are LODs in the 73 periphery than the reduction of the central area. 74

While much of the research has concentrated on the 75 degradation of resolution and geometric detail, chromatic 76 sensitivity has also been shown to have important effects 77 (see Sec. 7.2). Due to the complex inter-relations be-78 tween physiological and psychophysical factors, it has been 79 shown that color sensitivity is task-dependent, and that, 80 for search tasks, color precision cannot be reduced in the 81 same way as visual acuity [59]. For instance, when the 82 spatial detail is lowered by 50% after a  $^{\circ}$  viewing angle, 83 the chromatic reduction should not be dropped before  $0^{\circ}$ , 84 otherwise, deterioration may become visible. This task de-85 pendence is also emphasized by the differences in outcomes 86 of several user studies. Hansen et al. [81] recommend that 87 the color sensation becomes more *dichromatic* at about 88

 $^{\circ}$ - 0°, due to the lack of L and M cones, and becomes 89 absent at eccentricity after  $0^{\circ}$  for *weak stimuli*. However, 90 Ayma et al. [17] conduct color zone mapping with two user 91 experiments in which the results prove that color percep-92 tion is even better above  $0^{\circ}$  eccentricity; but, from the 93 mid-peripherv  $0^\circ$  , the red-green hue appears to be 94 less chromatic than yellow-blue due to the *post-receptoral* 95 cortical process. Similarly, Buck et al. [37] suggest that 96 the fovea-like color vision still exists out to at least 97 eccentricity. Besides the eccentricity, the stimulus size is 98 also a critical and crucial parameter for color perception. 99 Noorlander et al. [166] analyze that under specific spa-100 tial and temporal conditions, such as a large target size 101 and low temporal frequency (1 Hz), different hues can be 102 perceived at the eccentricity of up to  $0^{\circ}$ . However, color 103 perception is not constant across the life span. Webster et 104 al. [237] prove that the color degradation even is visible 105 after near periphery ° because of aging. 106

The high variability in reported results and the dependence on display, content, and degradation techniques indicates that considerable research is still required to find good ways to aggressively degrade quality in the center and periphery without impacting search performance.

Preprint Submitted for review / Computers & Graphics (2021)

#### 11. Conclusion 1

This survey has provided an integrative view of the do-2 main of foveated rendering, focused mainly on the tech-3 niques that have been employed to perform the optimiza-4 tion. Our first classification separates the methods into broad classes based on the main optimization performed: adaptive resolution, geometric simplification, shader simplification, and chromatic degradation, as well spatio-8 temporal deterioration techniques provides. We've seen q commonalities and differences among these methods, as 10 well as specializations to specific setups, in particular con-11 cerning dynamic or static gaze points and raycasting and 12 rasterization-based solutions. While the classes were well 13 14 separated, we have also seen that it is not uncommon that actual solutions borrow methods from all of them, 15 combining, e.g., the peripheral pixel undersampling of the 16 adaptive resolution, with adaptive LODs for geometry, and 17 spatio-temporal filters and caches. 18

The survey has also highlighted the substantial successes 19 of these techniques, and their proven capability to drive 20 a variety of applications. In terms of setups, moreover, 21 while it was mostly applied to VR displays for a long time, 22 recent years have seen an expansion towards near-eye AR 23 and large high-resolution displays. With the current trend 24 towards high-resolution displays covering large FOVs, it is 25 expected that the technique will become more and more 26 important. 27

However, despite the very significant successes and the 28 potentially enormous gains of the method, it is still true 29 that "foveated rendering is the holy grail in the mod-30 ern computer graphics world, exciting but virtually elu-31 sive" [63]. This is mostly because, in order to really un-32 leash its potential, foveation has to be applied very ag-33 gressively, which is extremely difficult, especially on large 34 and complex scenes with photorealistic lighting. Mod-35 erate peripheral degradation has been shown to produce 36 very high-quality experiences but also provides moderate 37 advantages with respect to other non-foreated adaptive 38 rendering techniques. Foveation gains start to be very 30 effective when the central region is small and peripheral 40 degradation is high. This is, however, not generally achiev-41 able without artifacts given today's state-of-the-art, as dis-42 cussed in Sec. 10. We expect developments in both the 43 computational and hardware-based solutions to eclipse to-44 day's best techniques in the near future, raising the stan-45 dard of foveated rendered graphics to new heights. 46

#### Acknowledgments 47

*<omitted for blind reviewing>* 

#### References 49

50 [1] S. Abu-El-Haija, N. Kothari, J. Lee, P. Natsev, G. TODERICI, B. VARADARAJAN, AND S. VIJAYANARASIMHAN, 51 Youtube-8m: A large-scale video classification benchmark, 52 2016.53

- [2] V. K. Adhikarla, A. Tariqul Islam, P. T. Kovács, and O. STAADT, Fast and efficient data reduction approach for multi-camera light field display telepresence systems, in 2013 3DTV Vision Beyond Depth (3DTV-CON), 2013, pp. 1-4.
- [3] B. A. Ahlborn, O. Kreylos, B. Hamann, and O. Staadt, A foveal inset for large display environments, in IEEE Virtual Reality Conference (VR 2006), 2006, pp. 281-282.
- [4] E. Akbas and M. P. Eckstein, Object detection through search with a foveated visual system, PLOS Computational Biology, 13 (2017), pp. 1–28.
- K. AKELEY, Reality engine graphics, in Proceedings of the [5]20th Annual Conference on Computer Graphics and Interactive Techniques, SIGGRAPH '93, New York, NY, USA, 1993, Association for Computing Machinery, p. 109–116.
- [6]T. Akenine-Möller, E. Haines, N. Hoffman, A. Pesce, M. IWANICKI, AND S. HILLAIRE, Real-Time Rendering 4th Edition, A K Peters/CRC Press, Boca Raton, FL, USA, 2018.
- [7] K. Akşit, P. Chakravarthula, K. Rathinavel, Y. Jeong, R. Albert, H. Fuchs, and D. Luebke, Manufacturing application-driven foveated near-eye displays, IEEE transactions on visualization and computer graphics, 25 (2019), pp. 1928-1939.
- [8] R. Albert, A. Patney, D. Luebke, and J. Kim, Latency requirements for foveated rendering in virtual reality, ACM Trans. Appl. Percept., 14 (2017).
- R. A. ALBERT, A. GODINEZ, AND D. LUEBKE, Reading speed [9] decreases for fast readers under gaze-contingent rendering, in ACM Symposium on Applied Perception 2019, SAP '19, New York, NY, USA, 2019, Association for Computing Machinery.
- [10] T. ANANPIRIYAKUL, J. ANGHEL, K. POTTER, AND A. JOSHI, A gaze-contingent system for foveated multiresolution visualization of vector and volumetric data, electronic imaging, 2020 (2020), pp. 374–1–374–11.
- [11] S. R. ANDERSEN, The history of the ophthalmological society of copenhagen 1900-50, Acta Ophthalmologica Scandinavica, 80 (2002), pp. 6–17.
- P. Andersson, J. Nilsson, T. Akenine-Möller, M. Oskars-[12]SON, K. ÅSTRÖM, AND M. D. FAIRCHILD, Flip: A difference evaluator for alternating images, Proc. ACM Comput. Graph. Interact. Tech., 3 (2020).
- [13]C. ANDREWS, A. ENDERT, B. YOST, AND C. NORTH, Information visualization on large, high-resolution displays: Issues, challenges, and opportunities, Information Visualization, 10 (2011), p. 341-355.
- [14] E. ARABADZHIYSKA, O. T. TURSUN, K. MYSZKOWSKI, H.-P. SEIDEL, AND P. DIDYK, Saccade landing position prediction for gaze-contingent rendering, ACM Trans. Graph., 36 (2017).
- [15]H. AUBERT AND R. FOERSTER, Untersuchungen über den Raumsinn der Retina. II.: H.Aubert: Ueber die Grenzen der Farbenwahrnehmung auf dem seitlichen Theilen der Retina., 1857.
- [16] T. AXBLAD, Impact of foveated rendering on path tracing frame rate in head- mounted vr displays, Master's thesis, KTH, School of Electrical Engineering and Computer Science (EECS), 2020.
- [17] M. Ayama, M. Sakurai, O. Carlander, G. Derefeldt, and 109 L. ERIKSSON, Color appearance in peripheral vision, in Human 110 Vision and Electronic Imaging IX, B. E. Rogowitz and T. N. 111 Pappas, eds., vol. 5292, International Society for Optics and 112 Photonics, SPIE, 2004, pp. 260 – 271. 113
- [18] J. BAE, J. LEE, AND H. NAM, Variable clock and em signal generation scheme for foveation-based driving oled head-mounted displays, Electronics, 10 (2021).
- [19] M. BALSA RODRIGUEZ, E. GOBBETTI, J. IGLESIAS GUITIÁN, 117 M. Makhinya, F. Marton, R. Pajarola, and S. Suter, 118 State-of-the-art in compressed gpu-based direct volume ren-119 dering, Computer Graphics Forum, 33 (2014), pp. 77–100.
- [20] G. R. BARNES, Vestibulo-ocular function during co-ordinated 121 head and eye movements to acquire visual targets., The Journal 122 of Physiology, 287 (1979), pp. 127-147. 123
- [21] B. A. BARSKY, Vision-realistic rendering: Simulation of the 124 scanned foveal image from wavefront data of human subjects. 125

54

55

56

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

100

101

102

103

104

105

106

107

108

114

115

116

1

2

3

4

5

6

7

8

9

10

11

12

13

14

15

16

17

18

19

20

21

22

23

24

25

26

27

28

29

30

31

32

33

34

35

36

37

38

39

40

41

42

43

44

45

46

47

48

49

50

51

52

53

54

55

56

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

Preprint Submitted for review / Computers & Graphics (2021)

in Proceedings of the 1st Symposium on Applied Perception in Graphics and Visualization, APGV '04, New York, NY, USA, 2004, Association for Computing Machinery, p. 73–81.

- [22] B. BASTANI, E. TURNER, C. VIERI, H. JIANG, B. FUNT, AND N. BALRAM, Foveated pipeline for ar/vr head-mounted displays, Information Display, 33 (2017), pp. 14–19 and 35.
- [23] P. BAUDISCH, D. DECARLO, A. T. DUCHOWSKI, AND W. S. GEISLER, Focusing on the essential: Considering attention in display design, Commun. ACM, 46 (2003), p. 60–66.
- [24] P. BAUDISCH, N. GOOD, V. BELLOTTI, AND P. SCHRAEDLEY, Keeping things in context: A comparative evaluation of focus plus context screens, overviews, and zooming, in Proceedings of the SIGCHI Conference on Human Factors in Computing Systems, CHI '02, New York, NY, USA, 2002, Association for Computing Machinery, p. 259–266.
- [25] B. BEHNAM AND T. ERIC, Google AI Blog introducing a new foveation pipeline for virtual/mixed reality. https://ai.googleblog.com/2017/12/ introducing-new-foveation-pipeline-for.html. Accessed: 2021-04-03.
- [26] K. BEKTAŞ, A. ÇÖLTEKIN, J. KRÜGER, A. T. DUCHOWSKI, AND S. I. FABRIKANT, Geoged: Improved visual search via gazecontingent display, in Proceedings of the 11th ACM Symposium on Eye Tracking Research & amp; Applications, ETRA '19, New York, NY, USA, 2019, Association for Computing Machinery.
- [27] K. BEKTAS, A. CÖLTEKIN, J. KRÜGER, AND A. T. DUCHOWSKI, A testbed combining visual perception models for geographic gaze contingent displays, in Eurographics Conference on Visualization (EuroVis) - Short Papers, E. Bertini, J. Kennedy, and E. Puppo, eds., The Eurographics Association, 2015.
- [28] H. BENKO, E. OFEK, F. ZHENG, AND A. D. WILSON, Fovear: Combining an optically see-through near-eye display with projector-based spatial augmented reality, in Proceedings of the 28th Annual ACM Symposium on User Interface Software & amp; Technology, UIST '15, New York, NY, USA, 2015, Association for Computing Machinery, p. 129–135.
- [29] S. BESENTHAL, S. MAISCH, AND T. ROPINSKI, Multi-resolution rendering for computationally expensive lighting effects, CoRR, abs/1906.04576 (2019).
- [30] E. W. BETHEL, B. TIERNEY, J. LEE, D. GUNTER, AND S. LAU, Using high-speed wans and network data caches to enable remote and distributed visualization, CoRR, abs/1801.09504 (2018).
- [31] F. BETTIO, E. GOBBETTI, F. MARTON, AND G. PINTORE, Scalable rendering of massive triangle meshes on light field displays, Computers & Graphics, 32 (2008), pp. 55–64.
- [32] J. BEYER, M. HADWIGER, AND H. PFISTER, State-of-the-art in gpu-based large-scale volume visualization, Comput. Graph. Forum, 34 (2015), p. 13–37.
- [33] T. BLASCHECK, K. KURZHALS, M. RASCHKE, M. BURCH, D. WEISKOPF, AND T. ERTL, Visualization of eye tracking data: A taxonomy and survey, Computer Graphics Forum, 36 (2017), pp. 260-284.
- [34] M. BÖHME, M. DORR, T. MARTINETZ, AND E. BARTH, Gazecontingent temporal filtering of video, in Proceedings of the 2006 Symposium on Eye Tracking Research & Computing, Applications, ETRA '06, New York, NY, USA, 2006, Association for Computing Machinery, p. 109–115.
- [35] N. D. B. BRUCE AND J. K. TSOTSOS, Saliency based on information maximization, in Proceedings of the 18th International Conference on Neural Information Processing Systems, NIPS'05, Cambridge, MA, USA, 2005, MIT Press, p. 155–162.
- [36] V. BRUDER, C. SCHULZ, R. BAUER, S. FREY, D. WEISKOPF, AND T. ERTL, Voronoi-based foveated volume rendering, in EuroVis 2019 - Short Papers, J. Johansson, F. Sadlo, and G. E. Marai, eds., The Eurographics Association, 2019.
- [37] S. L. BUCK, R. KNIGHT, G. FOWLER, AND B. HUNT, Rod influence on hue-scaling functions, Vision Research, 38 (1998), pp. 3259–3263.
- [38] K. CATER, A. CHALMERS, AND P. LEDDA, Selective quality rendering by exploiting human inattentional blindness: Look-

ing but not seeing, in Proceedings of the ACM Symposium on Virtual Reality Software and Technology, VRST '02, New York, NY, USA, 2002, Association for Computing Machinery, p. 17–24.

- [39] A. H. CHAN AND A. J. COURTNEY, Foveal acuity, peripheral acuity and search performance: A review, International Journal of Industrial Ergonomics, 18 (1996), pp. 113–119.
- [40] D. CHANDLER, Seven challenges in image quality assessment: Past, present, and future research, International Scholarly Research Notices, 2013 (2013), pp. 1–53.
- [41] C. CHANG, W. CUI, AND L. GAO, Foveated holographic neareye 3d display, Opt. Express, 28 (2020), pp. 1345–1356.
- [42] E.-C. CHANG, S. MALLAT, AND C. YAP, Wavelet foveation, Applied and Computational Harmonic Analysis, 9 (2000), pp. 312–335.
- [43] J. CHEN, L. MI, C. P. CHEN, H. LIU, J. JIANG, AND W. ZHANG, Design of foveated contact lens display for augmented reality, Opt. Express, 27 (2019), pp. 38204–38219.
- [44] I. CHENG, Foveated 3d model simplification, in Seventh International Symposium on Signal Processing and Its Applications, 2003. Proceedings., vol. 1, 2003, pp. 241–244 vol.1.
- [45] K. B. CHENLIANG CHANG, W. GORDON, L. BYOUNGHO, AND L. GAO, Toward the next-generation vr/ar optics: a review of holographic near-eye displays from a human-centric perspective, Optica, 7 (2020), pp. 1563–1578.
- [46] J. CHOI AND J. KO, Remotegl towards low-latency interactive cloud graphics experience for mobile devices (demo), in Proceedings of the 17th Annual International Conference on Mobile Systems, Applications, and Services, MobiSys '19, New York, NY, USA, 2019, Association for Computing Machinery, p. 693–694.
- [47] P. CIGNONI, F. GANOVELLI, E. GOBBETTI, F. MARTON, F. PONCHIO, AND R. SCOPIGNO, Adaptive TetraPuzzles – efficient out-of-core construction and visualization of gigantic polygonal models, ACM Transactions on Graphics, 23 (2004), pp. 796–803.
- [48] A. ÇÖLTEKIN AND H. HAGGRÉN, Stereo foveation, The Photogrammetric Journal of Finland, 20 (2006), pp. 45–54.
- [49] R. L. COOK, T. PORTER, AND L. CARPENTER, Distributed ray tracing, in Proceedings of the 11th Annual Conference on Computer Graphics and Interactive Techniques, SIGGRAPH '84, New York, NY, USA, 1984, Association for Computing Machinery, p. 137–145.
- [50] E. CUERVO, K. CHINTALAPUDI, AND M. KOTARU, Creating the perfect illusion: What will it take to create life-like virtual reality headsets?, in Proceedings of the 19th International Workshop on Mobile Computing Systems & amp; Applications, Hot-Mobile '18, New York, NY, USA, 2018, Association for Computing Machinery, p. 7–12.
- [51] E. CUERVO AND D. CHU, Poster: Mobile virtual reality for head-mounted displays with interactive streaming video and likelihood-based foveation, in Proceedings of the 14th Annual International Conference on Mobile Systems, Applications, and Services Companion, MobiSys '16 Companion, New York, NY, USA, 2016, Association for Computing Machinery, p. 130.
- [52] R. J. DEELEY, N. DRASDO, AND W. N. CHARMAN, A simple parametric model of the human ocular modulation transfer function, Ophthalmic and Physiological Optics, 11 (1991), pp. 91–93.
- [53] H. DEUBEL, W. X. SCHNEIDER, ET AL., Saccade target selection and object recognition: Evidence for a common attentional mechanism, Vision research, 36 (1996), pp. 1827–1838.
- [54] O. DEUSSEN, M. SPICKER, AND Q. ZHENG, Weighted lindebuzo-gray stippling, ACM Trans. Graph., 36 (2017).
- [55] A. DEZA, A. JONNALAGADDA, AND M. P. ECKSTEIN, Towards metamerism via foveated style transfer, CoRR, abs/1705.10041 (2017).
- [56] M. DORR, T. MARTINETZ, M. BÖHME, AND E. BARTH, Visibility of temporal blur on a gaze-contingent display, in Proceedings of the 2nd Symposium on Applied Perception in Graphics and Visualization, APGV '05, New York, NY, USA, 2005, Association for Computing Machinery, p. 33–36.

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

109

110

111

112

113

114

115

116

117

118

119

120

121

122

123

124

125

126

127

128

129

130

131

132

133

134

135

136

137

138

139

140

141

142

143

Preprint Submitted for review / Computers & Graphics (2021)

[57] A. DUCHOWSKI, Eye Tracking Methodology: Theory and Practice, Springer-Verlag London, 01 2007.

2

3

4

5

6

7

8

9

10

11

12

13

14

15

16

17

18

19

20

21

22

23

24

25

26

27

28

29

30

31

32

33

34

35

36

37

38

39

40

41

42

43

44

45

46

47

48

49

50

51

52

53

54

55

56

57

58

59

60

61

62

63

64

65

66

67

68

69

70

71

72

- [58]A. T. DUCHOWSKI, Gaze-based interaction: A 30 year retro*spective*, Computers & Graphics, 73 (2018), pp. 59 – 69.
- [59]A. T. DUCHOWSKI, D. BATE, P. STRINGFELLOW, K. THAKUR, B. J. MELLOY, AND A. K. GRAMOPADHYE, On spatiochromatic visual sensitivity and peripheral color lod management, ACM Trans. Appl. Percept., 6 (2009).
- [60]A. T. DUCHOWSKI AND A. ÇÖLTEKIN, Foveated gaze-contingent displays for peripheral lod management, 3d visualization, and stereo imaging, ACM Trans. Multimedia Comput. Commun. Appl., 3 (2007).
- [61] A. T. DUCHOWSKI, N. COURNIA, AND H. MURPHY, Gazecontingent displays: A review, CyberPsychology & Behavior, 7 (2004), pp. 621–634. PMID: 15687796.
- [62] M. Everingham, L. Van Gool, C. K. I. Williams, J. Winn, AND A. ZISSERMAN, The PASCAL Visual Object Classes Challenge 2007 (VOC2007) Results. http://www.pascalnetwork.org/challenges/VOC/voc2007/workshop/index.html.
- [63]M. FINCH, B. GUENTER, AND J. SNYDER, Foveated 3d display, in ACM SIGGRAPH 2013 Emerging Technologies, SIG-GRAPH '13, New York, NY, USA, 2013, Association for Computing Machinery.
- [64] L. H. FRANK, J. G. CASALI, AND W. W. WIERWILLE, Effects of visual display and motion system delays on operator performance and uneasiness in a driving simulator, Human Factors, 30 (1988), pp. 201–217. PMID: 3384446.
- [65]L. FRANKE, L. FINK, J. MARTSCHINKE, K. SELGRAD, AND M. STAMMINGER, Time-warped foveated rendering for virtual reality headsets, Computer Graphics Forum, 40 (2021), pp. 110-123.
- [66] L. FRIDMAN, B. JENIK, S. KESHVARI, B. REIMER, C. ZETZSCHE, AND R. ROSENHOLTZ, Sideeye: A generative neural network based simulator of human peripheral vision, 2017.
- [67] F. FRIESS, M. BRAUN, V. BRUDER, S. FREY, G. REINA, AND T. ERTL, Foveated encoding for large high-resolution displays, IEEE Transactions on Visualization and Computer Graphics, 27 (2021), pp. 1850–1859.
- [68] S. FRISTON, T. RITSCHEL, AND A. STEED, Perceptual rasterization for head-mounted display image synthesis, ACM Trans. Graph., 38 (2019).
- [69]M. FUJITA AND T. HARADA, Foveated real-time ray tracing for virtual reality headset, Light Transport Entertainment Research, (2014).
- [70]T. A. FUNKHOUSER AND C. H. SÉQUIN, Adaptive display algorithm for interactive frame rates during visualization of complex virtual environments, in Proceedings of the 20th Annual Conference on Computer Graphics and Interactive Techniques, SIGGRAPH '93, New York, NY, USA, 1993, Association for Computing Machinery, p. 247–254.
- [71] C. GAO, Y. PENG, H. LI, AND X. LIU, Toward low-computation light field displays by foveated rendering, in Optical Architectures for Displays and Sensing in Augmented, Virtual, and Mixed Reality (AR, VR, MR) II, B. C. Kress and C. Peroz, eds., vol. 11765, International Society for Optics and Photonics, SPIE, 2021, pp. 254 – 259.
- [72] W. S. GEISLER AND J. S. PERRY, Real-time foveated multiresolution system for low-bandwidth video communication, in Human Vision and Electronic Imaging III, B. E. Rogowitz and T. N. Pappas, eds., vol. 3299, International Society for Optics and Photonics, SPIE, 1998, pp. 294 - 305.
- W. S. GEISLER AND J. S. PERRY, Real-time simulation of ar-[73]bitrary visual fields, in Proceedings of the 2002 Symposium on Eye Tracking Research & amp; Applications, ETRA '02, New York, NY, USA, 2002, Association for Computing Machinery, p. 83–87.
- [74] A. S. GLASSNER, Principles of digital image synthesis, Elsevier, 2014.
- E. GOBBETTI AND F. MARTON, Layered point clouds a simple [75]and efficient multiresolution structure for distributing and rendering gigantic point-sampled models, Computers & Graphics, 28 (2004), pp. 815-826.

- [76] E. GOBBETTI AND F. MARTON, Far voxels: A multiresolution framework for interactive rendering of huge complex 3d models on commodity graphics platforms, ACM Trans. Graph., 24 (2005), p. 878–885.
- [77] G. GODIN, J. FRANÇOIS LALONDE, AND L. BORGEAT, Dualresolution stereoscopic display with scene-adaptive fovea boundaries, in in 8th International Immersive Projection Technology Workshop (to appear, 2004, pp. 13-14.
- [78]G. GODIN, P. MASSICOTTE, AND L. BORGEAT, High-resolution insets in projector-based stereoscopic displays: principles and techniques, in Stereoscopic Displays and Virtual Reality Systems XIII, A. J. Woods, N. A. Dodgson, J. O. Merritt, M. T. Bolas, and I. E. McDowall, eds., vol. 6055, International Society for Optics and Photonics, SPIE, 2006, pp. 136 - 147.
- [79]B. GUENTER, Motion compensated noise reduction, Tech. Rep. MSR-TR-94-05, Microsoft Research, March 1994.
- [80] B. GUENTER, M. FINCH, S. DRUCKER, D. TAN, AND J. SNY-DER, Foveated 3D graphics, ACM Transactions on Graphics, 31(2012).
- [81]T. HANSEN, L. PRACEJUS, AND K. GEGENFURTNER, Color perception in the intermediate periphery of the visual field., Journal of vision, 9 4 (2009), pp. 26.1–12.
- Y. HE, Y. GU, AND K. FATAHALIAN, Extending the graph-[82] ics pipeline with adaptive, multi-rate shading, ACM Trans. Graph., 33 (2014).
- [83] D. HOFFMAN, Z. MERAZ, AND E. TURNER, Limits of peripheral acuity and implications for vr system design, Journal of the Society for Information Display, 26 (2018), pp. 483-495.
- [84] J. HONG, Foveation in near-eye holographic display, in 2018 International Conference on Information and Communication Technology Convergence (ICTC), 2018, pp. 602–604.
- [85] J. HONG, Y. KIM, S. HONG, C. SHIN, AND H. KANG, Gaze contingent hologram synthesis for holographic head-mounted display, in Practical Holography XXX: Materials and Applications, H. I. Bjelkhagen and V. M. B. Jr., eds., vol. 9771, International Society for Optics and Photonics, SPIE, 2016, pp. 117 – 122.
- [86] D. HOOD, Lower-level visual processing and models of light adaptation, Annual review of psychology, 49 (1998), pp. 503-535.
- [87] E. HORVITZ AND J. LENGYEL, Perception, attention, and resources: A decision-theoretic approach to graphics rendering, in Proceedings of the Thirteenth Conference on Uncertainty in Artificial Intelligence, UAI'97, San Francisco, CA, USA, 1997, Morgan Kaufmann Publishers Inc., p. 238-249.
- [88] C.-F. HSU, A. CHEN, C.-H. HSU, C.-Y. HUANG, C.-L. LEI, AND K.-T. CHEN, Is foveated rendering perceivable in virtual reality? exploring the efficiency and consistency of quality assessment methods, in Proceedings of the 25th ACM International Conference on Multimedia, MM '17, New York, NY, USA, 2017, Association for Computing Machinery, p. 55-63.
- [89] H. HUA, Enabling focus cues in head-mounted displays, Proceedings of the IEEE, 105 (2017), pp. 805-824.
- [90] H. HUA AND S. LIU, Dual-sensor foveated imaging system, Appl. Opt., 47 (2008), pp. 317–327.
- [91] R. HUSSAIN, M. CHESSA, AND F. SOLARI, Mitigating cybersickness in virtual reality systems through foreated depth-of-field blur, Sensors, 21 (2021).
- [92]G. Illahi, M. Siekkinen, and E. Masala, Foveated video streaming for cloud gaming, in 2017 IEEE 19th International Workshop on Multimedia Signal Processing (MMSP), 2017, 133 pp. 1-6.
- [93] G. K. Illahi, T. V. Gemert, M. Siekkinen, E. Masala, A. OULASVIRTA, AND A. YLÄ-JÄÄSKI, Cloud gaming with foveated graphics, CoRR, abs/1809.05823 (2018).
- [94] G. K. Illahi, T. V. Gemert, M. Siekkinen, E. Masala, 138 A. OULASVIRTA, AND A. YLÄ-JÄÄSKI, Cloud gaming with 139 foveated video encoding, ACM Trans. Multimedia Comput. 140 Commun. Appl., 16 (2020). 141
- [95]H. J. JANG, J. Y. LEE, J. KIM, J. KWAK, AND J.-H. PARK, 142 Progress of display performances: Ar, vr, qled, and oled, Jour-143 nal of Information Display, 21 (2020), pp. 1-9. 144

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

100

101

102

103

104

105

106

107

108

109

110

111

112

113

114

115

116

117

118

119

120

121

122

123

124

125

126

127

128

129

130

131

132

134

135

136

32

1

2

3

4

5

6

7

8

9

10

11

12

13

14

15

16

17

18

19

20

21

22

23

24

25

26

27

28

29

30

31

32

33

34

35

36

37

38

39

40

41

44

45

46

47

48

49

50

51

52

53

54

55

56

57

58

59

60

61

62

63

64

65

66

67

Preprint Submitted for review / Computers & Graphics (2021)

- [96] Q. JI AND X. YANG, Real time visual cues extraction for monitoring driver vigilance, in Computer Vision Systems, B. Schiele and G. Sagerer, eds., Berlin, Heidelberg, 2001, Springer Berlin Heidelberg, pp. 107–124.
- [97] H. JIANG, T. NING, AND B. BASTANI, Efficient peripheral flicker reduction for foveated rendering in mobile vr systems, in 2020 IEEE Conference on Virtual Reality and 3D User Interfaces Abstracts and Workshops (VRW), 2020, pp. 802-803.
- [98]Y. JIN, M. CHEN, T. G. BELL, Z. WAN, AND A. BOVIK, Study of 2D foveated video quality in virtual reality, in Applications of Digital Image Processing XLIII, A. G. Tescher and T. Ebrahimi, eds., vol. 11510, International Society for Optics and Photonics, SPIE, 2020, pp. 18 - 26.
- Y. Jin, M. Chen, T. Goodall, A. Patney, and A. C. [99]  $\operatorname{Bovik},$  Subjective and objective quality assessment of 2d and 3d foveated video compression in virtual reality, IEEE Transactions on Image Processing, (2021), pp. 1-1.
- [100] H. JISOO, K. YOUNGMIN, H. SUNGHEE, S. CHOONSUNG, AND K. HOONJONG, Near-eye foveated holographic display, in Imaging and Applied Optics 2018 (3D, AO, AIO, COSI, DH, IS, LACSEA, LS&C, MATH, pcAOP), Optical Society of America, 2018, p. 3M2G.4.
- [101] P. JOHANSSON, Perceptually modulatedlevel of detail in real time graphics, 2013.
- [102]JOSEF SPJUT, BEN BOUDAOUD, JONGHYUN KIM, TREY GREER, RACHEL ALBERT, MICHAEL STENGEL, KAAN AKŞIT, DAVID LUEBKE, Towards Standardized Classification of Foveated Displays, IEEE Transactions on Visualization and Computer Graphics, 26 (May, 2020), pp. 2126–2134.
- [103] Y.-G. JU AND J.-H. PARK, Foveated computer-generated hologram and its progressive update using triangular mesh scene model for near-eye displays, Opt. Express, 27 (2019), pp. 23725–23738.
- [104] K. KANOV, R. BURNS, C. LALESCU, AND G. EYINK, The johns hopkins turbulence databases: an open simulation laboratory for turbulence research, Computing in Science & Engineering, 17 (2015), pp. 10–17.
- [105] D. KANTER, Graphics processing requirements for enabling immersive vr, 10 2015.
- [106]A. S. KAPLANYAN, A. SOCHENOV, T. LEIMKÜHLER, M. OKUNEV, T. GOODALL, AND G. RUFO, Deepfovea: Neural reconstruction for foveated rendering and video compression 42 using learned statistics of natural videos, ACM Trans. Graph., 43 38(2019).
  - [107] A. KAR AND P. CORCORAN, A review and analysis of eyegaze estimation systems, algorithms and performance evaluation methods in consumer platforms, IEEE Access, 5 (2017), pp. 16495–16519.
  - [108] D. KELLY, Spatial frequency selectivity in the retina, Vision Research, 15 (1975), pp. 665–672.
  - [109] H. KIM, J. YANG, J. LEE, S. YOON, Y. KIM, M. CHOI, J. YANG, E. RYU, AND W. PARK, Eye tracking-based 360 vr foveated/tiled video rendering, in 2018 IEEE International Conference on Multimedia Expo Workshops (ICMEW), 2018, рр. 1–1.
  - [110] J. KIM, Y. JEONG, M. STENGEL, K. AKŞIT, R. ALBERT, B. BOUDAOUD, T. GREER, J. KIM, W. LOPES, Z. MAJER-CIK, P. SHIRLEY, J. SPJUT, M. MCGUIRE, AND D. LUEBKE, Foveated ar: Dynamically-foveated augmented reality display, ACM Trans. Graph., 38 (2019)
  - [111] J. KIM, Q. SUN, F. HUANG, L. WEI, D. LUEBKE, AND A. KAUF-MAN, Perceptual studies for foveated light field displays, ArXiv, abs/1708.06034 (2017).
  - [112]J.-H. KIM, K.-W. ON, W. LIM, J. KIM, J.-W. HA, AND B.-T. ZHANG, Hadamard product for low-rank bilinear pooling, arXiv preprint arXiv:1610.04325, (2016).
- V. KIRAN ADHIKARLA, F. MARTON, T. BALOGH, AND E. GOB-[113]BETTI, Real-time adaptive content retargeting for live multi-68 view capture and light field display, The Visual Computer, 31 69 (2015), pp. 1023-1032. 70
- [114] R. KONRAD, A. ANGELOPOULOS, AND G. WETZSTEIN, Gaze-71 contingent ocular parallax rendering for virtual reality, ACM 72

Trans. Graph., 39 (2020).

- [115] M. Koskela, K. Immonen, T. VIITANEN, P. JÄÄSKELÄINEN, J. MULTANEN, AND J. TAKALA, Foveated instant preview for progressive rendering, in SIGGRAPH Asia 2017 Technical Briefs, SA '17, New York, NY, USA, 2017, Association for Computing Machinery.
- [116] M. Koskela, K. Immonen, T. VIITANEN, P. JÄÄSKELÄINEN, J. MULTANEN, AND J. TAKALA, Instantaneous foveated preview for progressive monte carlo rendering, Computational Visual Media, 4 (2018), pp. 267-276.
- [117] M. Koskela, A. Lotvonen, M. Mäkitalo, P. Kivi, T. Viita-NEN, AND P. JÄÄSKELÄINEN, Foveated Real-Time Path Tracing in Visual-Polar Space, in Eurographics Symposium on Rendering - DL-only and Industry Track, T. Boubekeur and P. Sen, eds., The Eurographics Association, 2019.
- [118] M. KOSKELA, T. VIITANEN, P. JÄÄSKELÄINEN, AND J. TAKALA, Foveated path tracing, in Advances in Visual Computing, G. Bebis, R. Boyle, B. Parvin, D. Koracin, F. Porikli, S. Skaff, A. Entezari, J. Min, D. Iwai, A. Sadagic, C. Scheidegger, and T. Isenberg, eds., Cham, 2016, Springer International Publishing, pp. 723–732.
- [119] G. A. Koulieris, K. Akşit, M. Stengel, R. K. Mantiuk, K. MANIA, AND C. RICHARDT, Near-eye display and tracking technologies for virtual and augmented reality, Computer Graphics Forum, 38 (2019), pp. 493–519.
- [120] B. KRAJANCICH, P. KELLNHOFER, AND G. WETZSTEIN, A perceptual model for eccentricity-dependent spatio-temporalflicker fusion and its applications to foveated graphics, ArXiv, abs/2104.13514 (2021).
- [121] V. LABHISHETTY, S. A. CHOLEWIAK, AND M. S. BANKS, Contributions of foveal and non-foveal retina to the human eye's focusing response, Journal of Vision, 19 (2019), pp. 18-18.
- [122] S. LAINE AND T. KARRAS, Efficient sparse voxel octrees, IEEE Transactions on Visualization and Computer Graphics, 17 (2010), pp. 1048–1059.
- S. LEE, J. CHO, B. LEE, Y. JO, C. JANG, D. KIM, AND B. LEE, [123]Foveated retinal optimization for see-through near-eye multilayer displays, IEEE Access, 6 (2018), pp. 2170-2180.
- [124] S. LEE, M. PATTICHIS, AND A. BOVIK, Foveated video quality assessment, IEEE Transactions on Multimedia, 4 (2002), pp. 129–132.
- [125] J. LEMLEY, A. KAR, AND P. CORCORAN, Eye tracking in augmented spaces: A deep learning approach, in 2018 IEEE Games, Entertainment, Media Conference (GEM), 2018, pp. 1-6.
- [126] J. LEMLEY, A. KAR, A. DRIMBAREAN, AND P. CORCORAN, Convolutional neural network implementation for eye-gaze estimation on low-quality consumer imaging systems, IEEE Transactions on Consumer Electronics, 65 (2019), pp. 179-187.
- [127] M. LEVOY AND R. WHITAKER, Gaze-directed volume rendering, SIGGRAPH Comput. Graph., 24 (1990), p. 217-223.
- [128] D. LI, R. DU, A. BABU, C. D. BRUMAR, AND A. VARSHNEY, A Log-Rectilinear Transformation for Foveated 360-degree Video Streaming, IEEE Transactions on Visualization and Computer Graphics, (2021), pp. 1–1.
- [129] R. LI, E. WHITMIRE, M. STENGEL, B. BOUDAOUD, J. KAUTZ, D. LUEBKE, S. PATEL, AND K. AKŞIT, Optical gaze tracking with spatially-sparse single-pixel detectors, in 2020 IEEE International Symposium on Mixed and Augmented Reality (IS-MAR), 2020, pp. 117–126.
- [130] W. LIN AND C.-C. JAY KUO, Perceptual visual quality metrics: A survey, Journal of Visual Communication and Image Representation, 22 (2011), pp. 297-312.
- [131]T. LINDEBERG, Concealing rendering simplifications using gazecontingent depth of field, Master's thesis, KTH, School of Computer Science and Communication (CSC), 2016.
- [132] S. LIU AND H. HUA, Spatialchromatic foveation for gaze contingent displays, in Proceedings of the 2008 Symposium on Eye Tracking Research & amp; Applications, ETRA '08, New York, NY, USA, 2008, Association for Computing Machinery, p. 139-142.
- [133] T. LIU, J. SUN, N. ZHENG, X. TANG, AND H. SHUM, Learning to

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

100

101

102

103

104

105

106

107

108

109

110

111

112

113

114

115

116

117

118

119

120

121

122

123

124

125

126

127

128

129

130

131

132

133

134

135

136

137

138

139

140

141

142

143

144

detect a salient object, in 2007 IEEE Conference on Computer Vision and Pattern Recognition, 2007, pp. 1-8.

[134] L. C. LOSCHKY AND G. W. MCCONKIE, User performance with gaze contingent multiresolutional displays, in Proceedings of the 2000 Symposium on Eye Tracking Research & amp; Applications, ETRA '00, New York, NY, USA, 2000, Association for Computing Machinery, p. 97–103.

6

8

g

10

11

12

13

14

15

16

17

18

19

20

21

22

23

24

25

26

27

28

29

30

31

32

33

34

35

36

37

38

39

40

41

42

43

44

45

46

47

48

49

50

51

52

53

54

55

56

57

58

59

60

61

62

66

- [135] L. C. LOSCHKY AND G. S. WOLVERTON, How late can you update gaze-contingent multiresolutional displays without detection?, ACM Trans. Multimedia Comput. Commun. Appl., 3(2007)
- [136] D. LUEBKE AND B. HALLEN, Perceptually driven simplification for interactive rendering, in Proceedings of the 12th Eurographics Conference on Rendering, EGWR'01, Goslar, DEU, 2001, Eurographics Association, p. 223-234.
- [137] D. LUEBKE, B. HALLEN, D. NEWFIELD, AND B. WATSON, Perceptually driven simplification using gaze-directed rendering, tech. rep., University of Virginia, 09 2000.
- [138]P. LUNGARO AND K. TOLLMAR, Eye-gaze based service provision and qoe optimization, in Proc. 5th ISCA/DEGA Workshop on Perceptual Quality of Systems (PQS 2016), 2016, pp. 1–5.
- [139]A. MAIMONE, A. GEORGIOU, AND J. S. KOLLIN, Holographic near-eye displays for virtual and augmented reality, ACM Trans. Graph., 36 (2017).
- [140] E. MALKIN, A. DEZA, AND T. POGGIO, Cuda-optimized realtime rendering of a foveated visual system, 2020.
- [141] S. G. MALLAT, A theory for multiresolution signal decomposition: the wavelet representation, IEEE Transactions on Pattern Analysis and Machine Intelligence, 11 (1989), pp. 674–693.
- [142]R. MANTIUK, Chapter 10 - gaze-dependent tone mapping for hdr video, in High Dynamic Range Video, A. Chalmers, P. Campisi, P. Shirley, and I. G. Olaizola, eds., Academic Press, 2017, pp. 189-199.
- [143] R. MANTIUK, Gaze-dependent screen space ambient occlusion, in Computer Vision and Graphics, L. J. Chmielewski, R. Kozera, A. Orłowski, K. Wojciechowski, A. M. Bruckstein, and N. Petkov, eds., Cham, 2018, Springer International Publishing, pp. 16-27.
- [144] R. MANTIUK AND S. JANUS, Gaze-dependent ambient occlusion, in Advances in Visual Computing, G. Bebis, R. Boyle, B. Parvin, D. Koracin, C. Fowlkes, S. Wang, M.-H. Choi, S. Mantler, J. Schulze, D. Acevedo, K. Mueller, and M. Papka, eds., Berlin, Heidelberg, 2012, Springer Berlin Heidelberg, pp. 523-532.
- [145] R. MANTIUK, K. J. KIM, A. G. REMPEL, AND W. HEIDRICH, Hdr-vdp-2: A calibrated visual metric for visibility and quality predictions in all luminance conditions, ACM Trans. Graph., 30(2011).
- [146] R. MANTIUK AND M. MARKOWSKI, Gaze-dependent tone mapping, in Image Analysis and Recognition, M. Kamel and A. Campilho, eds., Berlin, Heidelberg, 2013, Springer Berlin Heidelberg, pp. 426–433.
- [147] R. K. MANTIUK, G. DENES, A. CHAPIRO, A. KAPLANYAN, G. RUFO, R. BACHY, T. LIAN, AND A. PATNEY, Fovvideovdp: A visible difference predictor for wide field-of-view video, ACM Trans. Graph., 40 (2021).
- [148]N.-X. MARIANOS, Foveated rendering algorithms using eyetracking technology in virtual reality, diploma work, Technical University of Crete, 2018.
- R. MARTIN, Specification and evaluation of level of detail se-[149]*lection criteria*, Virtual Real., 3 (1998), pp. 132–143.
- [150] S. MATTHEWS, A. URIBE-QUEVEDO, AND A. THEODOROU, Ren-63 dering optimizations for virtual reality using eye-tracking, in 64 2020 22nd Symposium on Virtual and Augmented Reality 65 (SVR), 2020, pp. 398–405.
- M. MAUDERER, S. CONTE, M. A. NACENTA, AND D. VISH-67 [151]WANATH, Depth perception with gaze-contingent depth of field, 68 in Proceedings of the SIGCHI Conference on Human Factors 69 in Computing Systems, CHI '14, New York, NY, USA, 2014, 70 Association for Computing Machinery, p. 217–226. 71
- [152] M. MAUDERER, D. R. FLATLA, AND M. A. NACENTA, 72

Gaze-Contingent Manipulation of Color Perception, Association for Computing Machinery, New York, NY, USA, 2016, p. 5191-5202.

- [153] C. D. MCMURROUGH, V. METSIS, J. RICH, AND F. MAKE-DON, An eye tracking dataset for point of gaze detection, in Proceedings of the Symposium on Eye Tracking Research and Applications, ETRA '12, New York, NY, USA, 2012, Association for Computing Machinery, p. 305–308.
- [154]X. MENG, R. DU, J. F. JAJA, AND A. VARSHNEY, 3d-kernel foveated rendering for light fields, IEEE Transactions on Visualization and Computer Graphics, (2020), pp. 1–1.
- [155] X. MENG, R. DU, AND A. VARSHNEY, Eye-dominance-guided foveated rendering, IEEE Transactions on Visualization and Computer Graphics, 26 (2020), pp. 1972–1980.
- X. MENG, R. DU, M. ZWICKER, AND A. VARSHNEY, Ker-[156]nel foveated rendering, Proc. ACM Comput. Graph. Interact. Tech., 1 (2018).
- [157] T. MIKAMI, K. HIRAI, T. NAKAGUCHI, AND N. TSUMURA, Realtime tone-mapping of high dynamic range image using gazing area information, in Proc. International Conference on Computer and Information, 2010.
- [158] I. S. MOHAMMADI, M. HASHEMI, AND M. GHANBARI, An objectbased framework for cloud gaming using player's visual attention, in 2015 IEEE International Conference on Multimedia Expo Workshops (ICMEW), 2015, pp. 1–6.
- [159]R. A. A. MOHAMMED AND O. STAADT, Learning eye movements strategies on tiled large high-resolution displays using inverse reinforcement learning, in 2015 International Joint Conference on Neural Networks (IJCNN), 2015, pp. 1–7.
- [160] B. MORA, Naive ray-tracing: A divide-and-conquer approach, ACM Trans. Graph., 30 (2011).
- [161] K. T. MULLEN, The contrast sensitivity of human colour vision to red-green and blue-yellow chromatic gratings., The Journal of physiology, 359 (1985), pp. 381-400.
- [162] H. MURPHY AND A. DUCHOWSKI, Gaze-contingent level of detail rendering, EuroGraphics, 2001 (2001).
- [163] H. A. MURPHY, A. T. DUCHOWSKI, AND R. A. TYRRELL, Hybrid image/model-based gaze-contingent rendering, ACM Trans. Appl. Percept., 5 (2009).
- [164]K. Myszkowski, Perception-based global illumination, rendering, and animation techniques, in Proceedings of the 18th Spring Conference on Computer Graphics, SCCG '02, New York, NY, USA, 2002, Association for Computing Machinery, p. 13–24.
- [165] D. NEHAB, P. V. SANDER, AND J. R. ISIDORO, The real-time reprojection cache, in ACM SIGGRAPH 2006 Sketches, SIG-GRAPH '06, New York, NY, USA, 2006, Association for Computing Machinery, p. 185–es.
- [166]C. NOORLANDER, J. J. KOENDERINK, R. J. DEN OLDEN, AND B. W. EDENS, Sensitivity to spatiotemporal colour contrast in the peripheral visual field, Vision Research, 23 (1983), pp. 1–11.
- [167] T. OHSHIMA, H. YAMAMOTO, AND H. TAMURA, Gaze-directed adaptive rendering for interacting with virtual space, in Proceedings of the IEEE 1996 Virtual Reality Annual International Symposium, 1996, pp. 103–110.
- [168] C. PAPADOPOULOS AND A. E. KAUFMAN, Acuity-driven gigapixel visualization, IEEE Transactions on Visualization and Computer Graphics, 19 (2013), pp. 2886–2895.
- [169]S. PARK, Y. I. KIM, AND H. NAM, Foveation-based reduced resolution driving scheme for immersive virtual reality displays, Opt. Express, 27 (2019), pp. 29594-29605.
- [170] D. PARKHURST AND E. NIEBUR, A feasibility test for perceptually adaptive level of detail rendering on desktop systems, in Proceedings of the 1st Symposium on Applied Perception in Graphics and Visualization, APGV '04, New York, NY, USA, 2004, Association for Computing Machinery, p. 49-56.
- [171] D. J. PARKHURST AND E. NIEBUR, Variable-resolution displays: A theoretical, practical, and behavioral evaluation, Human Fac-140 tors, 44 (2002), pp. 611–629. PMID: 12691369.
- [172]A. PATNEY, J. KIM, M. SALVI, A. KAPLANYAN, C. WYMAN, 142 N. BENTY, A. LEFOHN, AND D. LUEBKE, Perceptually-based 143 foveated virtual reality, in ACM SIGGRAPH 2016 Emerging 144

73

74

75

76

77

78

79

80

81

82

83

84

137

138

139

34

1

2

3

4

5

6

7

8

9

11

12

13

14

15

16

17

18

19

20

21

22

23

24

27

29

30

31

32

33

34

35

36

37

38

39

41

42

43

44

45

46

47

48

49

50

51

52

53

54

55

56

57

58

59

60

61

62

63 64

65

66

67

68

69

Preprint Submitted for review / Computers & Graphics (2021)

Technologies, SIGGRAPH '16, New York, NY, USA, 2016, Association for Computing Machinery.

- A. PATNEY, M. SALVI, J. KIM, A. KAPLANYAN, C. WYMAN, [173]N. BENTY, D. LUEBKE, AND A. LEFOHN, Towards foveated rendering for gaze-tracked virtual reality, ACM Trans. Graph., 35 (2016).
- [174] J. S. PERRY AND W. S. GEISLER, Gaze-contingent real-time simulation of arbitrary visual fields, in Human Vision and Electronic Imaging VII, B. E. Rogowitz and T. N. Pappas, eds., vol. 4662, International Society for Optics and Photon-10 ics, SPIE, 2002, pp. 57-69.
  - [175] A. PEUHKURINEN AND T. MIKKONEN, Real-time human eye resolution ray tracing in mixed reality, in Proc. GRAPP, 2021, рр. 169-176.
  - S. PICCAND, R. NOUMEIR, AND E. PAQUETTE, Efficient visual-[176]ization of volume data sets with region of interest and wavelets, in Medical Imaging 2005: Visualization, Image-Guided Procedures, and Display, R. L. G. Jr. and K. R. Cleary, eds., vol. 5744, International Society for Optics and Photonics, SPIE, 2005, pp. 462 – 470.
  - [177] D. POHL, T. BOLKART, S. NICKELS, AND O. GRAU, Using astigmatism in wide angle hmds to improve rendering, in 2015 IEEE Virtual Reality (VR), 2015, pp. 263–264.
- [178] D. POHL, G. S. JOHNSON, AND T. BOLKART, Improved prewarping for wide angle, head mounted displays, in Proceedings 25 26 of the 19th ACM Symposium on Virtual Reality Software and Technology, VRST '13, New York, NY, USA, 2013, Association for Computing Machinery, p. 259-262. 28
  - [179] D. POHL, X. ZHANG, AND A. BULLING, Combining eye tracking with optimizations for lens astigmatism in modern wide-angle hmds, in 2016 IEEE Virtual Reality (VR), 2016, pp. 269–270.
  - [180] D. POHL, X. ZHANG, A. BULLING, AND O. GRAU, Concept for using eye tracking in a head-mounted display to adapt rendering to the user's current visual field, in Proceedings of the 22nd ACM Conference on Virtual Reality Software and Technology, VRST '16, New York, NY, USA, 2016, Association for Computing Machinery, p. 323–324.
- [181] D. Purves, G. J. Augustine, D. Fitzpatrick, L. C. Katz, A.-S. LAMANTIA, J. O. MCNAMARA, S. M. WILLIAMS, ET AL., 40 Types of eye movements and their functions, Neuroscience, (2001), pp. 361-390.
  - [182]R. RADKOWSKI AND S. RAUL, Impact of foveated rendering on procedural task training, in Virtual, Augmented and Mixed Reality. Multimodal Interaction, J. Y. Chen and G. Fragomeni, eds., Cham, 2019, Springer International Publishing, pp. 258–267.
  - [183] M. REDDY, Perceptually modulated level of detail for virtual environments, PhD thesis, University of Edinburgh. College of Science and Engineering. School of ..., 1997.
  - [184] M. REDDY, Perceptually optimized 3d graphics, IEEE Computer Graphics and Applications, 21 (2001), pp. 68–75.
  - [185] S. M. REDER, On-line monitoring of eye-position signals in contingent and noncontingent paradigms, Behavior Research Methods & Instrumentation, 5 (1973), pp. 218–228.
  - [186] E. REINHARD, G. WARD, S. PATTANAIK, AND P. DEBEVEC, High Dynamic Range Imaging: Acquisition, Display, and Image-Based Lighting (The Morgan Kaufmann Series in Computer Graphics), Morgan Kaufmann Publishers Inc., San Francisco, CA, USA, 2005.
  - [187] R. A. RENSINK, Change detection, Annual Review of Psychology, 53 (2002), pp. 245-277. PMID: 11752486.
  - [188] S. RIMAC-DRLJE, M. VRANJES, AND D. ZAGAR, Foveated mean squared error—a novel video quality metric, Multimedia Tools and Applications, 49 (2009), pp. 425-445.
  - [189] M. F. ROMERO-RONDÓN, L. SASSATELLI, F. PRECIOSO, AND R. Aparicio-Pardo, Foveated streaming of virtual reality videos, in Proceedings of the 9th ACM Multimedia Systems Conference, MMSys '18, New York, NY, USA, 2018, Association for Computing Machinery, p. 494–497.
- [190]T. ROTH, M. WEIER, A. HINKENJANN, Y. LI, AND 70 P. SLUSALLEK, An analysis of eye-tracking data in foveated 71 ray tracing, in 2016 IEEE Second Workshop on Eye Tracking 72

and Visualization (ETVIS), 2016, pp. 69-73.

- [191] T. Roth, M. Weier, A. Hinkenjann, Y. Li, and P. SLUSALLEK, A quality-centered analysis of eye tracking data in foveated rendering, Journal of Eye Movement Research (JEMR), 10 (2017).
- [192] T. ROTH, M. WEIER, J. MAIERO, A. HINKENJANN, AND Y. LI, Guided high-quality rendering, in Advances in Visual Computing, G. Bebis, R. Boyle, B. Parvin, D. Koracin, I. Pavlidis, R. Feris, T. McGraw, M. Elendt, R. Kopper, E. Ragan, Z. Ye, and G. Weber, eds., Cham, 2015, Springer International Publishing, pp. 115–125.
- [193] J. RYOO, K. YUN, D. SAMARAS, S. R. DAS, AND G. ZELINSKY, Design and evaluation of a foveated video streaming service for commodity client devices, in Proc. International Conference on Multimedia Systems, 2016, pp. 1–11.
- [194] M. SAKURAI, M. AYAMA, AND T. KUMAGAI, Color appearance in the entire visual field: color zone map based on the unique hue component, J. Opt. Soc. Am. A, 20 (2003), pp. 1997-2009.
- [195] C. Scheel, F. Löffler, A. Lehmann, H. Schumann, and O. STAADT, Dynamic level of detail for tiled large highresolution displays, in Proc. Virtuelle Und Erweiterte Realität 2014, Berichte Aus Der Informatik, Shaker Verlag, 2014, pp. 109-119.
- [196] D. SCHERZER, L. YANG, O. MATTAUSCH, D. NEHAB, P. V. SANDER, M. WIMMER, AND E. EISEMANN, A survey on temporal coherence methods in real-time rendering, in EURO-GRAPHICS 2011 State of the Art Reports, Eurographics Association, 2011, pp. 101-126.
- [197] R. SHEA, J. LIU, E. C.-H. NGAI, AND Y. CUI, Cloud gaming: architecture and performance, IEEE network, 27 (2013), pp. 16–21.
- H. R. SHEIKH, B. L. EVANS, AND A. C. BOVIK, Real-time [198]foveation techniques for low bit rate video coding, Real-Time Imaging, 9 (2003), pp. 27-40.
- [199] S. SHIMIZU, Wide-angle foveation for all-purpose use, IEEE/ASME Transactions on Mechatronics, 13 (2008), pp. 587-597.
- [200] A. SIEKAWA, M. Chwesiuk, R. Mantiuk, AND R. PIÓRKOWSKI, Foveated ray tracing for vr headsets, in MultiMedia Modeling, I. Kompatsiaris, B. Huet, V. Mezaris, C. Gurrin, W.-H. Cheng, and S. Vrochidis, eds., Cham, 2019, Springer International Publishing, pp. 106–117.
- [201] A. SIEKAWA AND S. R. MANTIUK, Gaze-dependent ray tracing, in Proc. CESCG 2014: The 18th Central European Seminar on Computer Graphics, 2014.
- [202] J. SPJUT AND B. BOUDAOUD, Foveated displays: Toward classification of the emerging field, in ACM SIGGRAPH 2019 Talks, SIGGRAPH '19, New York, NY, USA, 2019, Association for Computing Machinery.
- [203] M. STENGEL, S. GROGORICK, M. EISEMANN, AND M. MAGNOR, 122 Adaptive image-space sampling for gaze-contingent real-time 123 rendering, Computer Graphics Forum, 35 (2016), pp. 129-139. 124
- [204]M. STENGEL AND M. MAGNOR, Gaze-contingent computational displays: Boosting perceptual fidelity, IEEE Signal Processing Magazine, 33 (2016), pp. 139–148.
- $\left[205\right]$  W. STEVE, Variable-rate shading (VRS) Win32 apps, Apr. 2019.
- [206] H. STRASBURGER, I. RENTSCHLER, AND M. JÜTTNER, Peripheral vision and pattern recognition: A review, Journal of vision, 11 (2011), p. 13.
- [207] Q. Sun, F.-C. Huang, J. Kim, L.-Y. Wei, D. Luebke, and A. KAUFMAN, Perceptually-guided foveation for light field displays, ACM Trans. Graph., 36 (2017).
- [208]I. E. SUTHERLAND, R. F. SPROULL, AND R. A. SCHUMACKER, A characterization of ten hidden-surface algorithms, ACM Computing Surveys, 6 (1974), pp. 1–55.
- [209] N. T. SWAFFORD, D. COSKER, AND K. MITCHELL, Latency aware foveated rendering in unreal engine 4, in Proceedings of the 12th European Conference on Visual Media Production. CVMP '15, New York, NY, USA, 2015, Association for Computing Machinery.
- [210] N. T. SWAFFORD, J. A. IGLESIAS-GUITIAN, C. KONIARIS,

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

100

101

102

103

104

105

106

107

108

109

110

111

112

113

114

115

116

117

118

119

120

121

125

126

127

128

129

130

131

132

133

134

135

136

137

138

139

140

141

142

143

144

73

#### Preprint Submitted for review / Computers & Graphics (2021)

B. MOON, D. COSKER, AND K. MITCHELL, User, metric, and computational evaluation of foveated rendering methods, in Proceedings of the ACM Symposium on Applied Perception, SAP '16, New York, NY, USA, 2016, Association for Computing Machinery, p. 7–14.

2

3

4

5

6

9

10

11

12

13

14

15

16

17

18

19

20

21

22

23

24

25

26

27

28

29

30

31

32

33

34

35

36

37

38

39

40

41

42

43

44

45

46

47

48

49

50

51

52

54

- [211] M. F. SYAWALUDIN, M. LEE, AND J.-I. HWANG, Foveation pipeline for 360° video-based telemedicine, Sensors (Basel, Switzerland), 20 (2020).
- [212]R. TAMSTORF AND H. PRITCHETT, The challenges of releasing the moana island scene, in Proc. EG Symposium on Rendering - Industrial track, 2019, pp. 73–74.
- [213] G. TAN, Y.-H. LEE, T. ZHAN, J. YANG, S. LIU, D. ZHAO, AND S.-T. WU, Foveated imaging for near-eye displays, Opt. Express, 26 (2018), pp. 25076–25085.
- G. TAN, Y.-H. LEE, T. ZHAN, J. YANG, S. LIU, D. ZHAO, AND [214]S.-T. WU, 45-4: Near-eye foveated display for achieving human visual acuity, SID Symposium Digest of Technical Papers, 50 (2019), pp. 624–627.
- [215] A. T.DUCHOWSKI, A breadth-first survey of eye-tracking applications, Behav Res Methods Instrum Comput., 34(4) (2002), pp. 455–70.
- [216] L. N. THIBOS, F. E. CHENEY, AND D. J. WALSH, Retinal limits to the detection and resolution of gratings, J. Opt. Soc. Am. A, 4 (1987), pp. 1524–1529.
- [217] V. THUMULURI AND M. SHARMA, A unified deep learning approach for foveated rendering novel view synthesis from sparse rgb-d light fields, in 2020 International Conference on 3D Immersion (IC3D), 2020, pp. 1-8.
- [218] R. THUNSTRÖM, Passive gaze-contingent techniques relation to system latency, Master's thesis, Blekinge Institute of Technology, 2014.
- [219] A. TIWARY, M. RAMANATHAN, AND J. KOSINKA, Accelerated foveated rendering based on adaptive tessellation, in Eurographics 2020 - Short Papers, A. Wilkie and F. Banterle, eds., The Eurographics Association, 2020.
- W. TSAI AND Y. LIU, Foveation-based image quality assess-[220]ment, in 2014 IEEE Visual Communications and Image Processing Conference, 2014, pp. 25–28.
- [221]Y.-J. TSAI, Y.-X. WANG, AND M. OUHYOUNG, Affordable system for measuring motion-to-photon latency of virtual reality in mobile devices, in SIGGRAPH Asia 2017 Posters, SA '17, New York, NY, USA, 2017, Association for Computing Machinery.
- [222] E. TURNER, H. JIANG, D. SAINT-MACARY, AND B. BASTANI, Phase-aligned foveated rendering for virtual reality headsets, in 2018 IEEE Conference on Virtual Reality and 3D User Interfaces (VR), 2018, pp. 1-2.
- [223]О. Т. Tursun, Ε. ARABADZHIYSKA-KOLEVA, Wernikowski, R. Mantiuk, H.-P. Seidel, Μ. K. MYSZKOWSKI, AND P. DIDYK, Luminance-contrast-aware foveated rendering, ACM Trans. Graph., 38 (2019).
- [224] C. W. TYLER, Analysis of visual modulation sensitivity. iii. 53 meridional variations in peripheral flicker sensitivity, J. Opt. Soc. Am. A, 4 (1987), pp. 1612–1619.
- K. VAIDYANATHAN, M. SALVI, R. TOTH, T. FOLEY, T. AKENINE-MÖLLER, J. NILSSON, J. MUNKBERG, J. HAS-[225]Toth, T. Foley, 55 56 SELGREN, M. SUGIHARA, P. CLARBERG, T. JANCZAK, AND 57 A. LEFOHN, Coarse Pixel Shading, in Eurographics/ ACM SIG-58 GRAPH Symposium on High Performance Graphics, I. Wald 59 and J. Ragan-Kelley, eds., The Eurographics Association, Sep 60 2014.61
- [226]C. VIERI, G. LEE, N. BALRAM, S. H. JUNG, J. Y. YANG, S. Y. 62 YOON, AND I. B. KANG, An 18 megapixel 4.3 inch 1443 ppi 120 63 hz oled display for wide field of view high acuity head mounted 64 displays, Journal of the Society for Information Display, 26 65 66 (2018), pp. 314-324.
- VIOLA, A. KANITSAR, AND M. GROLLER, Importance-67 [227]Ι. driven volume rendering, in IEEE Visualization 2004, 2004, 68 DD. 139-145. 69
- M. VRANJEŠ, S. RIMAC-DRLJE, AND D. VRANJEŠ, Foveation-[228]70 based content adaptive root mean squared error for video qual-71 ity assessment, Multimedia Tools and Applications, 77 (2018), 72

pp. 21053-21082.

- [229] Z. WANG AND A. BOVIK, Foveated image and video coding, Signal Processing and Communications, (2005).
- [230]Z. WANG, A. C. BOVIK, L. LU, AND J. L. KOULOHERIS, Foveated wavelet image quality index, in Applications of Digital Image Processing XXIV, A. G. Tescher, ed., vol. 4472, International Society for Optics and Photonics, SPIE, 2001, pp. 42 - 52.
- [231]A. WATSON, A formula for human retinal ganglion cell receptive field density as a function of visual field location, Journal of vision, 14 (2014).
- [232] B. WATSON, N. WALKER, AND L. HODGES, A user study evaluating level of detail degradation in the periphery of headmounted displays, in Framework for Interactive Virtual Environments (FIVE) Conference, 03 1996.
- [233]B. WATSON, N. WALKER, AND L. F. HODGES, Effectiveness of spatial level of detail degradation in the periphery of headmounted displays, in Conference Companion on Human Factors in Computing Systems, CHI '96, New York, NY, USA, 1996, Association for Computing Machinery, p. 227-228.
- [234] B. WATSON, N. WALKER, AND L. F. HODGES, Supra-threshold control of peripheral LOD, ACM Transactions on Graphics (TOG), 23 (2004), pp. 750-759.
- [235] B. WATSON, N. WALKER, L. F. HODGES, AND A. WORDEN, Managing level of detail through peripheral degradation: Effects on search performance with a head-mounted display, ACM Trans. Comput.-Hum. Interact., 4 (1997), p. 323-346.
- [236] K. WEAVER, Design and evaluation of a perceptually adaptive rendering system for immersive virtual reality environments. Master's thesis, Digital Repository @ Iowa State University, http://lib.dr.iastate.edu/, 2007.
- [237] M. WEBSTER, K. HALEN, A. J. MEYERS, P. WINKLER, AND J. WERNER, Colour appearance and compensation in the near periphery, Proceedings of the Royal Society B: Biological Sciences, 277 (2010), pp. 1817 - 1825.
- [238] L. WEI AND Y. SAKAMOTO, Fast calculation method with foveated rendering for computer-generated holograms using an angle-changeable ray-tracing method, Appl. Opt., 58 (2019), pp. A258-A266.
- [239]M. WEIER, Perception-driven rendering : techniques for the efficient visualization of 3D scenes including view- and gazecontingent approaches, PhD thesis, Saarland University, Saarbrücken, 2019.
- [240] M. Weier, J. Maiero, T. Roth, A. Hinkenjann, and 116 P. SLUSALLEK, Enhancing rendering performance with viewdirection-based rendering techniques for large, high resolution 118 multi-display systems, in 11. Workshop Virtuelle Realität und 119 Augmented Reality der GI-Fachgruppe VR/AR, September 2014.
- [241] M. WEIER, J. MAIERO, T. ROTH, A. HINKENJANN, AND P. SLUSALLEK, Lazy details for large high-resolution displays, 123 in SIGGRAPH Asia 2014 Posters, SA '14, New York, NY, USA, 2014, Association for Computing Machinery.
- [242] M. WEIER, T. ROTH, A. HINKENJANN, AND P. SLUSALLEK, 126 Foveated depth-of-field filtering in head-mounted displays, 127 ACM Trans. Appl. Percept., 15 (2018). 128
- [243] M. WEIER, T. ROTH, E. KRUIJFF, A. HINKENJANN, A. PÉRARD-GAYOT, P. SLUSALLEK, AND Y. LI, Foveated real-130 time ray tracing for head-mounted displays, Comput. Graph. Forum, 35 (2016), p. 289–298.
- [244]M. WEIER, M. STENGEL, T. ROTH, P. DIDYK, E. EISEMANN, M. EISEMANN, S. GROGORICK, A. HINKENJANN, E. KRUIJFF, M. MAGNOR, K. MYSZKOWSKI, AND P. SLUSALLEK, Perceptiondriven accelerated rendering, Comput. Graph. Forum, 36 (2017), p. 611-643.
- [245] F. W. WEYMOUTH, Visual sensory units and the minimal angle 138 of resolution<sup>\*</sup>, American Journal of Ophthalmology, 46 (1958), 139 pp. 102–113. 140
- [246]S. WINKLER, M. KUNT, AND C. J. VAN DEN BRANDEN LAM-141 BRECHT, Vision and Video: Models and Applications, Springer 142 US, 2001, pp. 201–229. 143
- $\left[ 247\right]$  J.-Y. WU and J. Kim, Prescription ar: a fully-customized 144

35

73

74

75

76

77

78

79

80

81

82

83

84

85

86

87

88

89

90

91

92

93

94

95

96

97

98

99

100

101

102

103

104

105

106

107

108

109

110

111

112

113

114

115

117

120

121

122

124

125

129

131

132

133

134

135

136

1

2

3

4

5

6

7

8

9

10

11

12

13

14 15

16

17

18

19 20

21 22

23

24

25 26

27

28

29

30 31

32 33

34 35

36 37

38

39

40 41

42

43

44

45

46

47 48

49

50

51

52 53

54

55

56

57

58

59

Preprint Submitted for review / Computers & Graphics (2021)

prescription-embedded augmented reality display, Opt. Express, 28 (2020), pp. 6225–6241.

- [248] K. XIAO, G. LIKTOR, AND K. VAIDYANATHAN, Coarse pixel shading with temporal supersampling, in Proceedings of the ACM SIGGRAPH Symposium on Interactive 3D Graphics and Games, I3D '18, New York, NY, USA, 2018, Association for Computing Machinery.
- [249] L. XIAO, A. KAPLANYAN, A. FIX, M. CHAPMAN, AND D. LAN-MAN, Deepfocus: Learned image synthesis for computational displays, ACM Trans. Graph., 37 (2018).
- [250] L. XIAO, S. NOURI, M. CHAPMAN, A. FIX, D. LANMAN, AND A. KAPLANYAN, Neural supersampling for real-time rendering, ACM Trans. Graph., 39 (2020).
- [251] J. XIONG, G. TAN, T. ZHAN, AND S.-T. WU, Breaking the fieldof-view limit in augmented reality with a scanning waveguide display, OSA Continuum, 3 (2020), pp. 2730–2740.
- [252] T. YAMAUCHI, T. MIKAMI, O. OUDA, T. NAKAGUCHI, AND N. TSUMURA, Improvement and evaluation of real-time tone mapping for high dynamic range images using gaze information, in Computer Vision – ACCV 2010 Workshops, R. Koch and F. Huang, eds., Berlin, Heidelberg, 2011, Springer Berlin Heidelberg, pp. 440–449.
- [253] J. YANG, X. LI, AND A. G. CAMPBELL, Variable rate ray tracing for virtual reality, in SIGGRAPH Asia 2020 Posters, SA '20, New York, NY, USA, 2020, Association for Computing Machinery.
- [254] L. YANG, D. NEHAB, P. V. SANDER, P. SITTHI-AMORN, J. LAWRENCE, AND H. HOPPE, *Amortized supersampling*, ACM Trans. Graph., 28 (2009), p. 1–12.
- [255] Y. YE, J. M. BOYCE, AND P. HANHART, Omnidirectional 0° Video Coding Technology in Responses to the Joint Call for Proposals on Video Compression With Capability Beyond HEVC, IEEE Transactions on Circuits and Systems for Video Technology, 30 (2020), pp. 1241–1252.
- [256] C. YOO, J. XIONG, S. MOON, D. YOO, C.-K. LEE, S.-T. WU, AND B. LEE, Foveated display system based on a doublet geometric phase lens, Opt. Express, 28 (2020), pp. 23690–23702.
- [257] S.-E. YOON, E. GOBBETTI, D. KASIK, AND D. MANOCHA, Realtime massive model rendering, Synthesis Lectures on Computer Graphics and Animation, 2 (2008), pp. 1–122.
- [258] H. YU, E. CHANG, Z. HUANG, AND Z. ZHENG, Fast rendering of foveated volumes in wavelet-based representation, Vis. Comput., 21 (2005), pp. 735–744.
- [259] L. ZHANG, R. ALBERT, J. KIM, AND D. LUEBKE, Developing a peripheral color tolerance model for gaze-contingent rendering, Journal of Vision, 19 (2019), pp. 298c–298c.
- [260] X. ZHANG, W. CHEN, Z. YANG, C. ZHU, AND Q. PENG, A new foveation ray casting approach for real-time rendering of 3d scenes, in 2011 12th International Conference on Computer-Aided Design and Computer Graphics, 2011, pp. 99–102.
- [261] X. ZHANG, Y. SUGANO, M. FRITZ, AND A. BULLING, Appearance-based gaze estimation in the wild, in Proc. of the IEEE Conference on Computer Vision and Pattern Recognition (CVPR), June 2015, pp. 4511–4520.
- [262] Z. ZHENG, Z. YANG, Y. ZHAN, Y. LI, AND W. YU, Perceptual model optimized efficient foveated rendering, in Proceedings of the 24th ACM Symposium on Virtual Reality Software and Technology, VRST '18, New York, NY, USA, 2018, Association for Computing Machinery.
- [263] B. ZHOU, A. LAPEDRIZA, J. XIAO, A. TORRALBA, AND
  A. OLIVA, Learning deep features for scene recognition using
  places database, in Advances in Neural Information Processing
  Systems, Z. Ghahramani, M. Welling, C. Cortes, N. Lawrence,
  and K. Q. Weinberger, eds., vol. 27, Curran Associates, Inc.,
  2014.

## Highlights

- A comprehensive survey of foveated rendering.
- General characteristics, commonalities, differences, advantages, and limitations.
- Exploit reduced acuity in peripheral vision for rendering at reduced costs.
- Classification and discussion of different techniques.
- We discuss application areas where foveated rendering is already in use today.

Graphical Abstract (for review)

Click here to access/download;Graphical Abstract (for review);foveated-renderingsurvey-graphical-abstract.png

#### An integrative view of foveated rendering 2. Related Surveys 5. - 8. Survey & Analysis of 3. Background rendering techniques 10. Discussion & Open problems 3.1 Human eye and vision 5. Adaptive resolution 3.2 Field of view 6. Geometric simplification 10.1 mproving current foveated rendering techniques 3.3 Eye movement estimation 7. Shading simplification & 3.4. Eye tracking chromatic degradation 10.2 Exploiting machine learning 3.5 Latency requirements 8. Spatio-temporal deterioration 10.3 Supporting multiple users 3.6 Visual acuity 10.4 Evaluating the visual quality of foveated rendering 3.7 Contrast sensitivity function 3.8 Adaptation effects 10.5 Studying the effects of foveation artifacts on user performance 9. Main opplications 4. Overview and classification 4.1 Peripheral degradation classes 9.1 Foveated visualization 9.2 Foveated compression 4.2 Static vs dynamic gaze 9.3 Foveated transmission 4.3 Rastarization vs ray-tracing

Credit Author Statement

Bipul Mohanto: Conceptualization, Methodology, Data Curation, Visualization, Writing - Original Draft, Writing - Review & Editing

ABM Tariqul Islam: Conceptualization, Methodology, Writing - Original Draft, Project administration

Enrico Gobbetti: Conceptualization, Methodology, Visualization, Writing - Review & Editing, Supervision, Funding acquisition

Oliver Staadt: Conceptualization, Methodology, Writing - Review & Editing, Supervision, Funding acquisition, Project administration

### **Declaration of interests**

 $\boxtimes$  The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

The authors declare the following financial interests/personal relationships which may be considered as potential competing interests: