Perceptual Evaluation of Photo-Realism in Real-Time 3D Augmented Reality

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Abstract: We present a framework for creating photo-realism of three-dimensional augmented objects, as well as a perceptual evaluating of the scenes. A setup utilizing different lighting conditions is created. Different parameters affecting the realism are evaluated. These are camera artefacts, shadows, number of lights for shading, highlights and geometry. The results show that silhouettes of the shadows and the geometry, and highlights on specular objects are important, as well as the simulation of noise, for creating a photo-realistic augmentation. Furthermore, a side by side comparison is conducted to verify that it is possible to render a virtual object in real-time, which is perceived as real under the best conditions.

1 INTRODUCTION

Virtual realism or photo-realism has always been a goal within 3D computer graphics (CG), where still art and the film industry have already benefited from photo-realistic rendering to integrate virtual elements and effects with a high level of realism. Augmented reality (AR) which by definition is a mix of a video-feed and virtual elements would also benefit from having the virtual visualisations reaching this level of realism. Nevertheless, several challenges still exist and realistic rendering of 3D graphics in real-time is still a future goal.

The goal of this work is to investigate whether it is possible to obtain such realism in a static environment. The purpose of the experiments is for test subjects to assess the realism of an object. The test subjects will be shown a scene with either a virtual or a real object and assess whether or not he or she believes it is real. Furthermore, a side by side comparison will be conducted (see example in Figure 1).

Even today the development of photo-realism within AR could help some industries. Some examples could be the medical (Azuma, 1997), architectural and entertainment industry, where precise replication of the real world is important and/or where aesthetic factors play a role.

It is well recognized in computer graphics that parameters such as high model complexity, accurate highlights and both low frequency shadows (soft shadows) and high frequency shadows (hard shadows) are important for realistic synthesis (Elhelw et al., 2008; Rademacher et al., 2001). Elhelw et al. mentions the importance of context in a scene, as well as the complexity of the human visual system and how to assess what is perceived by the user. Verbal answers combined with Likert scales are often too biased, therefore, Elhelw et al. performed a gaze study using eye-tracking. The results showed that highlight and silhouettes are important. Moreover, as the rendering in AR occurs in real-time the
minimization of computation usage is a requirement, hence a guidance for which quality of the different parameters to use would be beneficial and will be addressed in this work.

An overview of the framework will be described in the next section. Afterwards, the experiment setup and procedure is described in section 3 and 4, while the results are presented in section 5, followed by the discussion and conclusion.

2 FRAMEWORK

In order to investigate whether it is possible to obtain realism in AR, a controlled setup was needed to be able to isolate the parameters for the experiment. This setup should utilize the ability of watching the scene from different perspectives. To obtain a correct perspective, from which the virtual objects are rendered, marker based tracking was used. Additionally, test objects were needed, both in a physical and a virtual form. These should have different shapes and materials, to be able to evaluate the geometry and the shading. Two objects were chosen for the experiments, which can be seen in Figure 2. One way to transfer the physical objects into virtual objects is to reconstruct the objects from multiple images or by scanning. This way, a mesh and a texture can easily be generated. To illuminate the objects lights were needed. A common way to achieve realistic lighting given a static environment is to use an environmental map (Debevec, 1998; Agusanto et al., 2003). Lastly, it is important to address artefacts in relation to the rendering and the web-camera to integrate a virtual object into a videofeed (Klein and Murray, 2008). Therefore, some of the most important artefacts were addressed.

3 EXPERIMENT SETUP

Five lights with diffusers (three 65 × 65 cm and two 53 × 53 cm) were set up in a circle with a radius of 1.5 meters and with a distance to each other of 65 degrees (see Figure 3). In the centre there was a table on which the marker to be tracked was placed. The five lights were located one meter higher than the table and pointed upwards with a 45 degree angle to reflect the light in the white ceiling. A spot light was located higher than the ambient lights to minimize the length of the high frequency shadows from the objects, such that they were visible in the field of view of the camera. The whole setup was covered by white sheets to enhance the ambient illumination of the scene and to visually shield off the test scene from the test subjects.

To prevent the real object and the virtual object from occluding each other the angle of the positions from which the web-camera was capturing the scene was restricted to 90 degrees. Additionally, the camera had to be directed at the centre of the scene at all
time. To ensure this, a metal arm was installed onto the ceiling above the table which was able to rotate 90 degrees. However, this restricted the users’ freedom of movement, since only one rotational axis was used and only one distance from the web-camera to the object on the table was available. The web-camera was positioned closer to the centre of the scene to be able to see the details in the objects (see Figure 3).

To ensure real-time rendering, the screen space effects and tracking were performed on a desktop PC. The following specifications were given for the hardware used in the setup:

1. A Logitech C920 Pro web-camera, which features HD video recording in 1080p.
2. A 22” Samsung SyncMaster 226BW monitor, which has a resolution of 1680 by 1050 pixels and a contrast of 700:1.
3. A PC with an Intel i5 CPU, an AMD 6950 HD 1024MB RAM graphics card and 6 GB RAM.

For the execution of the 3D rendering and the marker based tracking Unity was used in combination with Qualcomm’s AR solution Vuforia. A 540p resolution was used for the tracking, as well as for displaying the scenes, because of the limitations of the camera in relation to real-time execution.

3.1 Test Objects

Instead of manually modelling the objects virtual replicas were generated using Autodesk’s 123D Catch. The replicas were generated through a capture of around 20 – 40 images per object taken from 360 degrees. Thereafter, the program reconstructed a 3D object from the images and generated the mesh and the corresponding UVs and texture map. Overall, the process was difficult because contrast features had to be added to the toy elephant and much manual refinement was required. However, the quality of the 3D object was acceptable, especially given the low cost of such a reconstruction of objects into a virtual space.

Additionally, two low-poly versions were created, which can be seen in Figure 4. A reflective object was initially included, but preliminary tests showed that the quality of it was too poor to be included in the experiments.

3.2 Light Generation

For illuminating the augmented objects in the rendering directional lights were used, which was automatically extracted from High Dynamic Range (HDR) latitude-longitude environmental maps, similar to approach taken in (Debevec, 2005; Madsen and Laursen, 2007).

In order to acquire an environment map, from which the virtual lights would be generated, the setup needed to be captured. Five photographs were taken with a fish-eye lens covering 180 degrees of view. The camera was placed at the position where the objects were presumed to be placed on the marker, such that the surfaces of the virtual objects received the correct light given in the environment. Moreover, the photographs were taken with nine different exposures ranging from 1/2000 of a second to 30 seconds, all with an aperture-stop of 8. Also, the process was repeated for both light conditions; ambient lighting only and ambient lighting with the spot light turned on. For the ambient setup only 7 exposures were used (1/125 to 30 seconds).

The raw image files were imported into the program Panoweeaver 8 Professional Edition and then stitched into a latitude and longitude environment map for each exposure. Thereafter, the environment maps were merged into a HDR image using all the exposure levels. This was achieved with Adobe Photoshop CS5.

To acquire the lights with the correct intensity, colour-temperature and distribution the HDR environment map was imported into HDR Shop (USC Institute for Creative Technologies, 2013). Here a plug-in using the median cut algorithm was used (Debevec, 2005). Median cut generates the lights in accordance with the intensity distribution in the environment map, and exports them to a text file. For use in Unity a custom script was written to read the exported text file correctly.

Median cut divides the energy because the image is interpreted as areas of light. This approach is good for ambient light scenes, since each light radia-
Figure 5: Example of how the generated lights (red dots) does not exactly align with the spot light in the upper right corner.

Figure 6: The pixel deviation from a mean calculated per pixel coordinate across all images, where the column height indicate number or occurrences. The red, green and blue channel are shown correspondingly. The graph is based on data from 50 images with resolutions of 960 × 540 pixels, all capturing a gray paper.

tion from a given area of a surface is correctly represented. However, if a scene with a spot light is represented by a low number of lights, the generated position of the spot might not be exactly on the right latitude-longitude position (see example in Figure 5). This could influence the shading of the virtual objects. Therefore, the spotlight was masked out from the environment map and lights were generated from this modified map. The spot light was then manually added to the scene and the intensity was matched with the physical spot light.

A set of 1024 lights was extracted from the HDR environmental maps with the ambient lighting to be used for global illumination. Additionally, sets of 2, 4, 8 and 16 lights was extracted from each of the two HDR environmental maps, hence for the ambient lighting and the spot lighting. These sets were to be used for evaluation of the number of lights needed to create a realistic shading.

3.3 Integration of the Virtual Objects

In order to integrate the augmented object as if it was a part of the video-feed, some artefacts had to be replicated and applied to the virtual object (Klein and Murray, 2008; Klein and Murray, 2010; Fischer et al., 2006). One of those is noise, which can be interpreted as a random deviation from a “true” pixel value. Therefore noise was measured by capturing a sequence of images (Bovik, 2005). The mean between the individual pixels in these images is assumed to be the “true” pixel value. From this mean the deviation is considered to be the noise. The deviation sampled from 50 images can be seen in Figure 6.

The noise samples did not account for the correlation between the RGB channels, therefore a covariance matrix was calculated, which addressed the noise variance and covariance in relation to the channels. With a Cholesky decomposing of the matrix, the random samples from the three channels could be transformed into correlated samples (Apiolaza, 2011; van den Berg, 2012). The correlated samples were randomly sampled for each pixel and saved in a texture, which was used by a screen-space shader that only added the deviation from the noise texture to the virtual object in the scene and not on the video-feed. The noise texture was repeated, and offset randomly for each frame in x- and y-directions, so the noise was not static. Moreover, anti-aliasing (AA) was used on the entire screen space. Because AA was applied on screen space it created a bit of blur and smoothed out the silhouettes of the 3D objects.

As the colours of the texture on the virtual object were noticeably different from the colours of the real objects in the video-feed a colour correction was needed. To balance the texture colour of the 3D objects, an implementation of colour matching was implemented. The implementation used histogram matching and required a region of interest (ROI) in a capture of the video-feed and a target texture. A summed histogram was created for the source ROI and the target texture. For a given pixel value in the target texture the number of occurrences was found in the histogram. For the given number of occurrences a pixel value was found in the histogram of the source ROI. Now the pixel value of the target texture could be mapped to the pixel value of the source ROI. The RGB channels were converted to HSV and each channel was histogram matched as this resulted in the most satisfying colour correction.

Internal tests showed that the quality of the method was not acceptable and it was realised that further corrections were needed to match the colours more exactly. The main problem was that if the texture was matched to a region of an image of the real object, the texture of the virtual object would gain double light — both from the lights implied in the image of the real object used for colour matching and from the shading of the lights in the virtual scene.
Instead, the colour and intensity of the texture was matched manually by perceptually modifying the ambient colour of the materials. This way, a plausible simulation of the real surface was created, yet not in a strict way.

4 EXPERIMENT DESIGN

In the original experiment design the users were able to move the web-camera freely to see the scene from different perspectives. However, a preliminary test showed that the tracking of the marker was not stable enough resulting in noticeable jittering. As this would compromise the purpose of the experiment, the experiment design was altered. In the altered design the test subjects were allowed to watch the scene from three positions. The test subject would move the monitor to the first position, where the tracking would be locked and the scene would be shown for 4 seconds. Then, the monitor would become black and the tracking would be enabled again, such that the test subject could move the monitor to the second position. Again the tracking would be locked and the scene would be shown for 4 seconds. The same procedure applied to the third position. The three positions was positioned with approximately 20 degrees of disparity.

By locking the position of the web-camera (and the virtual camera) to pre-defined positions, no jittering could be observed. However, it removed the element of a changing perspective dynamically. The test subject had to keep a distance of 60 cm from the screen to keep the basis consistent between the trials. The scene was visible for 4 seconds at each position, before the test subject had to assess. This procedure was repeated for each trial.

Before proceeding to the actual trials some mental calibration scenes were shown to the test subjects. These scenes contained examples of real and virtual objects (ones not used for the experiments) shown in both spot and ambient light. These examples provided all of the information needed about the lighting, the environment, the objects and the quality of the video-feed. This ensured that the test subjects knew what to expect in the scene and how the experiment would be conducted.

We performed two different types of experiments: 1) experiments with only the virtual object in the scene rendered with varying approaches and quality conditions — or the real object — and 2) experiments with both a virtual and a real object present simultaneous in a direct side by side comparison.

The first experiment intended to identify the thresholds or necessity of certain parameters. At first, the effect of artefacts (noise and anti-aliasing) was evaluated, as a lack of it might make it possible to identify the virtual objects. Given both a spot and an ambient light setup, both low and high frequency shadows could be present in the scene (see Figure 7). The high frequency shadow was evaluated both as rendered in real-time and as pre-rendered (baked into a semi-transparent ground plane, so the underlay was visible). The low frequency shadows were always baked, since they were a product of global illumination given 1024 lights from the environmental map, approximating the real light distribution in the scene. The number of lights needed to shade the objects (2 to 16 lights) was also evaluated, which was always performed in real-time. The number of lights was supposed to determine how accurate the light distribution should be in order to have a realistic shading on the objects. This is important since it is difficult to generate lights from the surrounding environment and the minimization of the light calculations could be beneficial. Moreover, the lack of highlights were also evaluated to assess the importance in AR solutions. This was achieved by displaying a specular object with and without specular highlights. Lastly, in order to confirm that model complexity is important and to see how important smooth silhouettes are in an AR context, the augmented objects were evaluated at three different polygon resolutions (see Figure 4).

Only the specular object (the toy elephant) was...
used for evaluating the artefacts, the shadows and shading, the highlights and the geometry. The real object was used as control to verify the realism of the representation of the physical scene.

The second experiment aimed at revealing the possibility of making a virtual object that could be perceived as real under the most difficult condition, that is when the virtual object is compared side by side to the real object and the test subjects are allowed to watch the scene for as long time and as many positions as wanted. The side by side comparison scenes were illuminated by the spot light. In this experiment the test subjects watched a scene with the diffuse objects side by side and a scene with the specular objects side by side.

The sequence of the scenes was randomised in both experiments, as well as the position of the objects was switched randomly in the side by side comparison.

5 RESULTS

The virtual objects were considered indistinguishable from the real objects if the ratio of answers approached random chance, that is when test subjects were just guessing. The probability for random chance is 50 %. However, this only holds for at least 100 observations (McKee et al., 1985), for smaller sample sizes it might not even be possible to get a significant result with the best possible data (Christensen, 2013). Therefore, another probability of 19 % is suggested to compensate for smaller samples sizes (Borg et al., 2012) and relates to the commonly used threshold of people guessing incorrectly at least 25 % of the times. It is beyond the scope of the presented paper to explain the advantage of using a probability of 19 %.

The null hypothesis is that people are able to recognise a virtual object. The critical number, $i_c$, of answers to significantly reject the null hypothesis can be calculated by the probability mass function for binomial distributions:

$$f(i|n,p_{null}) = \frac{n!}{i!(n-i)!} (p_{null})^i (1-p_{null})^{n-i}$$

(1)

where $p_{null} = 0.19$, $n$ is the sample size and $i$ is the number of incorrect assessments. The critical value, $i_c$, can then be calculated:

$$i_c(n,p_{null}) = \min \left\{ i \left| \sum_{j=i}^{n} f(j|n,p_{null}) < 0.05 \right. \right\}$$

(2)

The number of assessments that a virtual object is real have to be equal to or exceed the critical value $i_c$ for an object to be perceived as real in a statistically significant manner.

5.1 Evaluation of Parameters

Table 1: Number of answers out of 16 that a scene was real when evaluating camera and rendering artefacts. The scenes are shown in ambient lighting. Results in bold is equal to or exceed the critical value of 7 that a scene is significantly perceived as real. In the table it can be seen that 9 out of 16 test subjects assessed the real object to be real, hence it is above the critical value of 7.

<table>
<thead>
<tr>
<th></th>
<th>Noise</th>
<th>No noise</th>
<th>Real</th>
</tr>
</thead>
<tbody>
<tr>
<td>Anti-aliasing</td>
<td>5</td>
<td>4</td>
<td>9</td>
</tr>
<tr>
<td>No anti-aliasing</td>
<td>5</td>
<td>5</td>
<td></td>
</tr>
</tbody>
</table>

The experiment was conducted with 16 test subjects in the age of 21 to 30 years — one woman and 15 men. All had normal or corrected-to-normal vision and most test subjects were experienced with 3D computer graphics and augmented reality. The critical value for an object to be perceived as real given 16 test subjects is 7, as calculated by Equation 2.

The simulated artefacts of the camera and the rendering was evaluated to verify their importance in
augmented scenes. Each test subject watched each of the five scenes shown in Table 1 once in randomised order. As can be seen in the table, none of the virtual scenes were perceived as real, as they did not reach the critical value of 7. Only the real object was assessed as real.

The number of lights needed to create a perceptually realistic shading was evaluated in combination with different methods for creating shadows (see example in Figure 8). For the spot light environment two different methods for creating high frequency shadows were used; one pre-rendered and one in real-time. Both of these include pre-rendered low frequency shadows. For the ambient lighting environment pre-rendered low frequency shadows were evaluated, as well as a lower limit without any shadows. For this test the test subjects watched each of the 18 scenes once in randomised order. The results for these 18 combinations can be seen in Table 2. All of the scenes for the spot light environment were perceived as real. This means that just 2 ambient lights (plus the spot light) can be used to shade the object and both the pre-rendered and real-time high frequency shadow can be used when wanting to create photo-realistic objects. On the other hand, for the ambient lighting environment only the object with pre-rendered low frequency shadows shaded with 4 lights and the object without shadows shaded with 2 lights were significantly perceived as real.

The necessity of highlights on specular objects was also evaluated and the results can be seen in Table 3. The three scenes were showed once for each test subject. The results showed that only the object with specular highlights was perceived as real.

Lastly, the quality of the geometry of the object was evaluated. The quality in this context relates to the number of polygons that the object consist of. The quality was evaluated in both lighting conditions to assess whether or not the light had an influence. Test subjects watched the eight scenes once in randomised order. The results of the test can be seen in Table 4 where the high-polygon model was perceived as real in both lighting conditions. This does not apply for the object consisting of the medium amount of polygons as it is only perceived as real in the spot light environment. The low-polygon model was not perceived as real for any of the two lighting conditions.

5.2 Side by Side Comparison

As some of the virtual scenes in the first experiment were assessed to be real, it was of interest to determine if a virtual object could be assessed as real under the best conditions possible for the test subjects, namely in a direct side by side comparison. Additionally, test subjects should be able to watch the scene for as long as they want, for as many angles as they want (within the restricted 90 degrees of rotation).

This experiment was conducted with 15 test subjects between the age of 21 and 27, where one woman and 14 men participated. All had normal or corrected-to-normal vision and most test subjects were familiar with 3D computer graphics and augmented reality. The critical value for an object to be significantly perceived as real given 15 test subjects is 6.
Examples of the scenes that test subjects are watching can be seen in Figure 9. The results of the side by side comparison can be seen in Table 5, where it can be noted that only the diffuse virtual object was perceived as real in a statistically significant sense, when compared directly to a real object.

Figure 9: Image of the side by side comparison. Top: the real diffuse object to the left and the virtual diffuse object to the right. Bottom: the real specular object to the left and the virtual specular object to the right.

Table 5: Number of incorrect answers out of 15 for the side by side comparison of the two objects. Results in bold is equal to or exceed the critical value of 6 that a scene is significantly perceived as real.

<table>
<thead>
<tr>
<th></th>
<th>Diffuse</th>
<th>Specular</th>
</tr>
</thead>
<tbody>
<tr>
<td>Spot light</td>
<td>6</td>
<td>0</td>
</tr>
</tbody>
</table>

6 DISCUSSION

In the process of conducting the experiments many interesting subjects were found, which could be discussed. We present a selection of these that we find most interesting.

Even though the evaluation of artefacts did not prove any results, the generation of artefacts is still considered important to integrate a virtual object into a scene. We believe that virtual objects would otherwise look uncanny. This is supported by preliminary tests which showed that test subjects were able to pinpoint virtual objects solely based on the missing noise. However, the lack of noise was first noticed after a while, when the test subjects had gotten familiar with the scene. This indicates that noise is a subtle effect which must be evaluated over several trials.

When evaluating the shading and the shadows all of the objects in the spot light were perceived as real. This means that it is possible to use only two lights for creating ambient lighting when a strong spot light is present in the scene. Additionally, there is no need of pre-rendering high frequency shadows as they can be rendered in real-time, as long as they are of sufficient quality. Especially, the edges must be of a quality where no artefacts are present, as test subjects in particular were looking at the silhouettes of the shadows to determine the realism. For the scenes with only ambient lighting just two were perceived as real; two with few lights for shading the object. One reason might be that people are not used to watching scenes without any noticeable shadows, and therefore assess them as virtual, even though they are actually real. Otherwise, the ambient scenes might not have been set up and adjusted appropriately to be able to match the real one.

The results showed that highlights are important on specular objects in AR, as they would otherwise look uncanny. This extends the findings in previous research focusing on photo-realistic imagery (Elhelw et al., 2008).

Preliminary tests not described in this paper showed that if mental calibration is not used, test subjects will assess more objects as being virtual, even though they might be real, because the test subjects might not be familiar with the object used or the artefacts of the camera makes the scene look unnatural. In other words, the knowledge of the context is very important when conducting a perceptual experiment evaluating photo-realism. Therefore, mental calibration is suggested to compensate for bias in relation to the environment, the lighting, the objects and the quality of the video-feed. Without this knowledge the test subjects will have no basis for evaluating the objects displayed on the screen.

The texture maps of the virtual objects were generated from images taken in the lighting conditions in the setup. Additionally, the virtual objects with the texture maps applied were shaded by the lights generated from the HDR environmental maps. Therefore, the virtual object gained double lighting. One way to avoid double lighting on texture of the virtual objects would be to calculate the intensity and colour of the virtual lights hitting each point on the mesh, assumed that the intensities and colours of the virtual lights are adjusted to the corresponding physical light. Then the
texture of the object could be divided with this UV map with baked lights. This would remove the double lighting and only leave the albedo. However, as a perfect match of intensity and colour between the physical and virtual light is difficult to obtain this option was skipped due to time and resource limitations.

Despite best efforts we experienced that it was a difficult task to capture the physical setup and convert it to a virtual — and maintaining the right illumination throughout the pipeline. In most cases, the majority of the pipeline has to be redone if a step fails. Therefore, it is crucial to have a clearly defined setup and approach of how to capture it. In the best case, no changes are applied to the setup and hardware when capturing the environment and the objects.

As long as marker based tracking is not stable enough to be unnoticed the freedom of movement has to be restricted. Optionally, the tracking might be more stable on the expense of the frame-rate. Otherwise, another tracking method can be used.

7 CONCLUSION

It is proven that it is possible to render an augmented object in real-time (besides pre-rendered ambient shadows) which cannot be distinguished from a real object, even when compared side by side. This has been achieved by creating a setup to evaluate the visual realism of augmented objects, which took into consideration the environment and the artefacts of the video-feed. Results showed that highlights are important for the perception of realism, as well as silhouettes of objects and shadows. Furthermore, it was shown that real-time shadows can be of sufficient quality to enhance the perception of reality. Additionally, preliminary tests showed that simulation of camera noise is an important factor to integrate a virtual object.

8 FUTURE WORK

It would be of great interest to create a common way to capture the environment and maintain the units throughout the pipeline. With such guidelines it would be easier to quickly set up a photo-realistic scene, which can be used in an application.

More research is suggested evaluating other parameters, for instance colour bleeding and a larger variety of materials and shapes. Movement and animation, as well as context, could also be interesting. With moving objects the influence of motion blur could be evaluated. Also, the attention to an object would presumably be different. When evaluating context different sceneries and their influence on the objects could be evaluated.

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