

Ruofei Du, Eric Turner, Maksym Dzitsiuk, Luca Prasso, Ivo Duarte, Jason Dourgarian, Joao Afonso, Jose Pascoal, Josh Gladstone, Nuno Cruces, Shahram Izadi, Adarsh Kowdle, Konstantine Tsotsos, David Kim

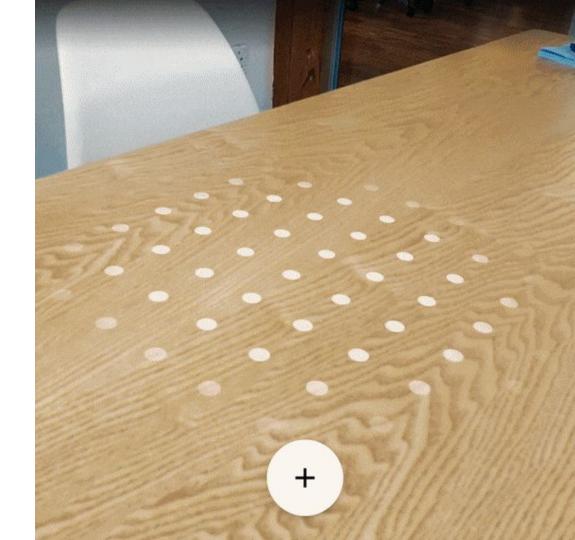
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Introduction Google's ARCore







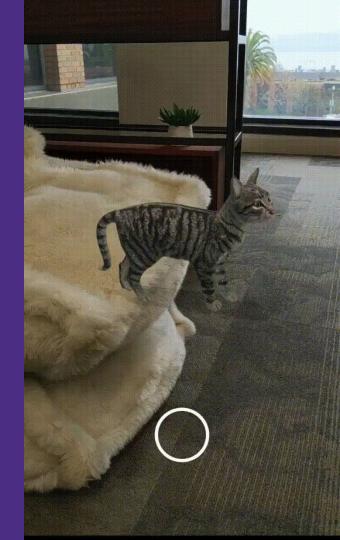


Is direct placement and rendering of 3D objects sufficient for realistic AR experiences?

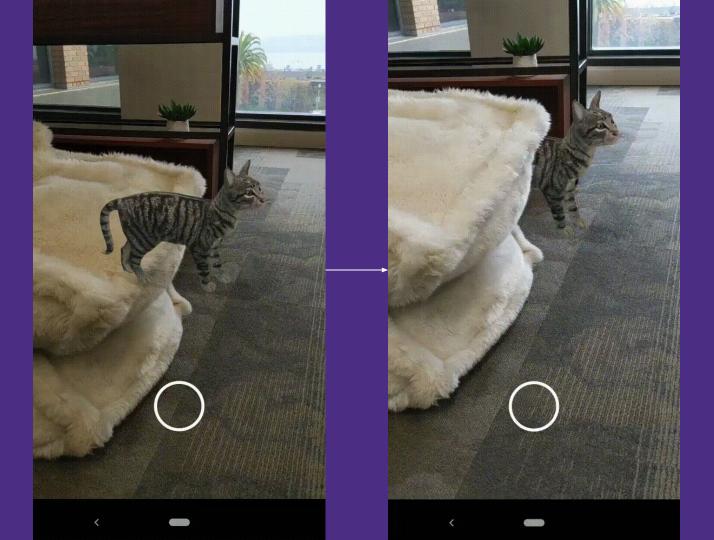


Not always!

Virtual content looks like it's "pasted on the screen" rather than "in the world"!

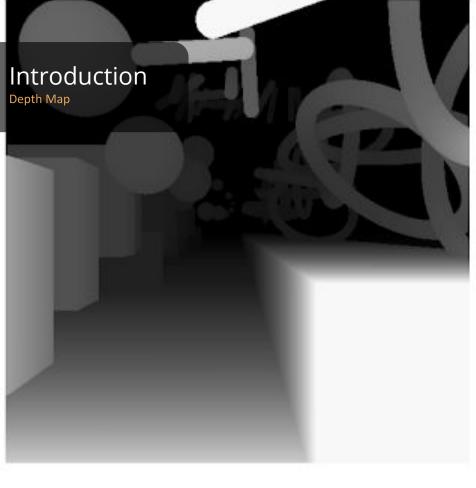


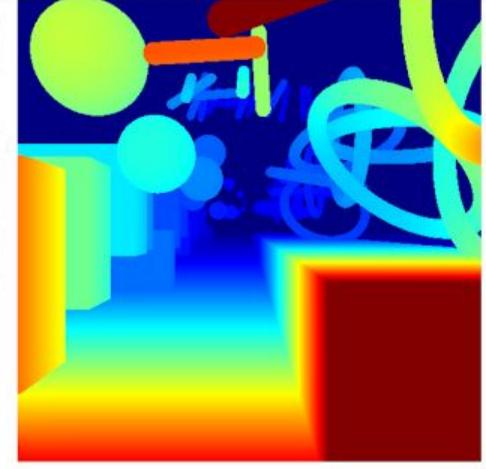
Introduction Motivation





How can we bring these advanced features to mobile AR experiences without relying on dedicated sensors or the need for computationally expensive surface reconstruction?





Introduction Depth Lab

Google
Huawei
LG
OnePlus
Орро
Samsung
Sony
_
Xiaomi

P30 Pro

OnePlus 7T Pro

Reno Ace

S20 Ultra 5G

Pocophone F1

And growing...

Pixel 2, Pixel 2 XL, Pixel 3, Pixel 3 XL, Pixel 3a, Pixel 3a XL, Pixel 4, Pixel 4 XL

•G8X ThinQ, V35 ThinQ, V50S ThinQ, V60 ThinQ 5G

Honor 10, Honor V20, Mate 20 Lite, Mate 20, Mate 20 X, Nova 3, Nova 4, P20, P30,

OnePlus 6, OnePlus 6T, OnePlus 7, OnePlus 7 Pro, OnePlus 7 Pro 5G, OnePlus 7T,

•Galaxy A80, Galaxy Note8, Galaxy Note9, Galaxy Note10, Galaxy Note10 5G, Galaxy Note10+, Galaxy Note10+ 5G, Galaxy S8, Galaxy S8+, Galaxy S9, Galaxy S9+, Galaxy S10e, Galaxy S10, Galaxy S10+, Galaxy S10 5G, Galaxy S20, Galaxy S20+ 5G, Galaxy

Xperia XZ2. Xperia XZ2 Compact. Xperia XZ2 Premium. Xperia XZ3

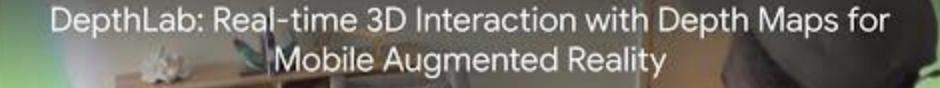
https://developers.google.com/ar/discover/supported-devices

Is there *more* to realism than occlusion?

Surface interaction?

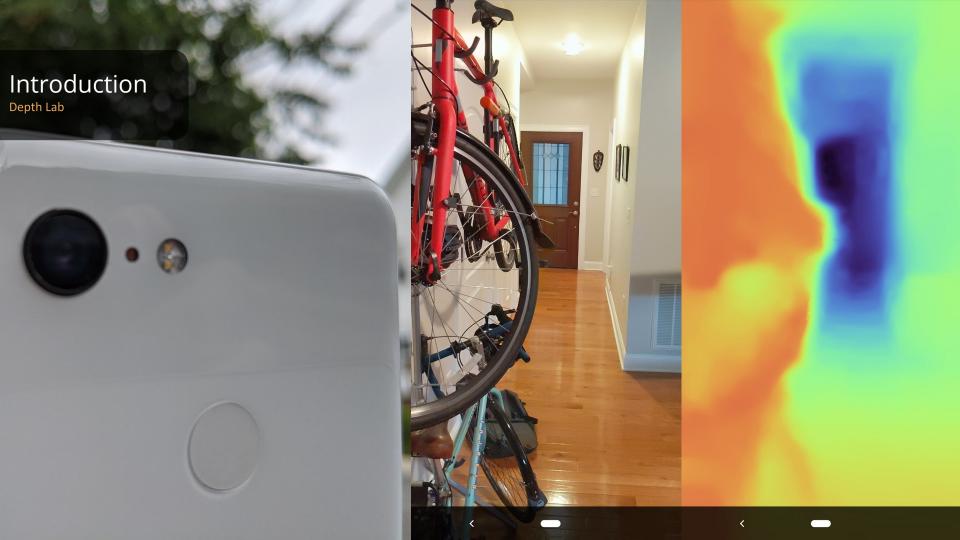
Realistic Physics?

Path Planning?



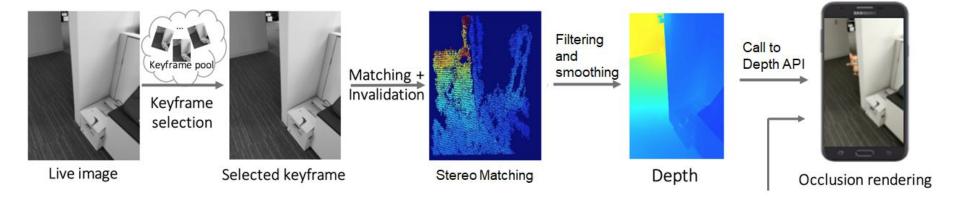
Ruofei Du, Eric Turner, Max Dzitsiuk, Luca Prasso, Ivo Duarte, Jason Dourgarian, Joao Afonso, Jose Pascoal, Josh Gladstone, Nuno Cruces, Shahram Izadi, Adarsh Kowdle, Konstantine Tsotsos, David Kim

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Related Work

Valentin et al



Asset from application





Introduction

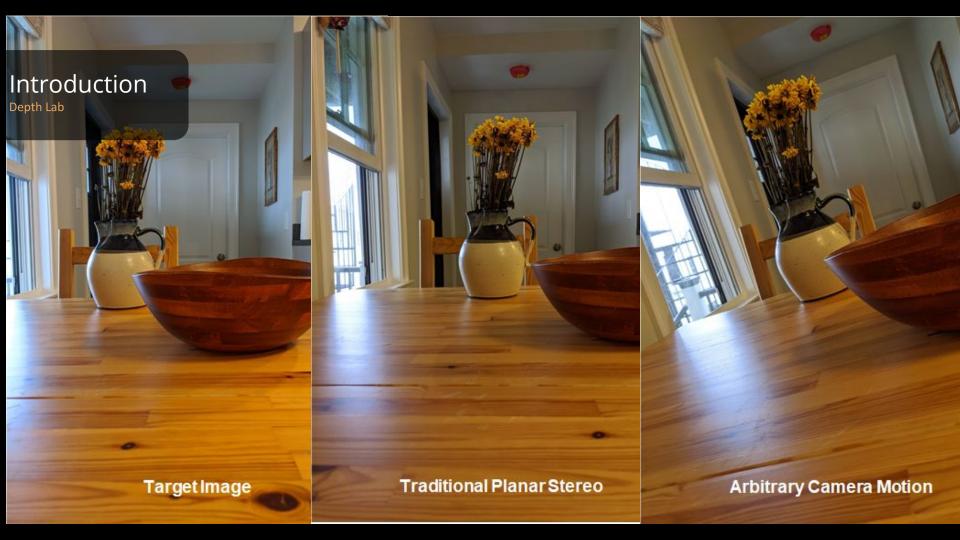
Depth Lab

Introduction

Depth Generatior

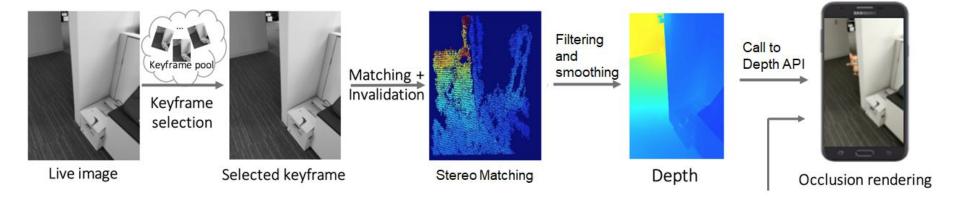






Related Work

Valentin et al



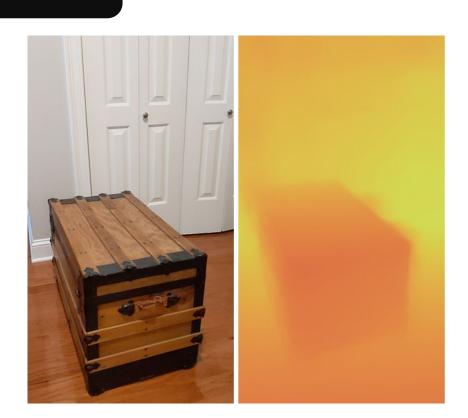
Asset from application





Introduction

Depth Lab

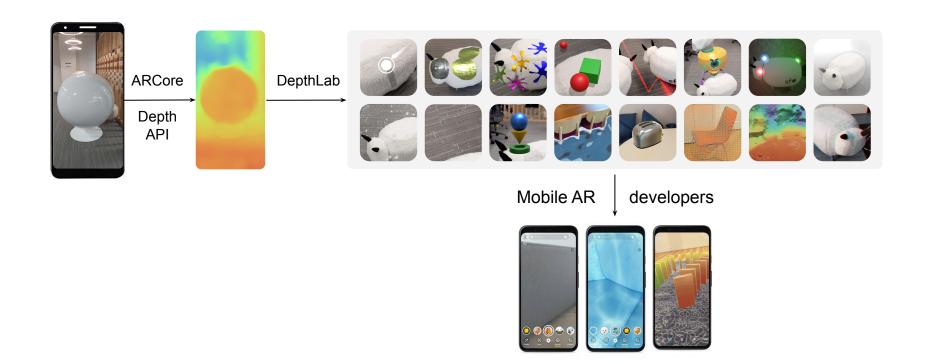


Up to 8 meters, with the best within 0.5m to 5m



Introduction

Depth Lal





Design Process

3 Brainstorming Sessions

- 8. Physical simulation: Simulate physical phenomena for augmented reality objects, e.g. collision. Implemented in DepthLab: Yes.
- 9. AR graffiti: Allow the user to touch on the screen and sketch/spray/paint virtual drawings onto physical objects. 10. AR painth

ser to throw color balloons onto ons should explode as texture

ground regions and render physical environment. The nerated where the environe predefined water level.

freeze a portion of the rial, and observe it from



the highest surface o it. However, this semantic segmen-

of the environpose the image vpoint. Project al 6-DoF pose

'depth-

e user

et the lepth

ed behind lmost all

20. Fog effects: Render screen-space post-processing effects,

21. Edge highlighting: Highlight the edges of the observed

23. False-color visualization and animated transition effects: Visualize the depth map based on a specific transfer





19. Rain effects: Similiar in behavior to the snow effect, the rain particles should also splat on the surface using the estimated normal vector from the localized depth. Implemented in DepthLab: Yes.

where far objects are overlaid with thicker fog. The user may interactively adjust the fog intensity in real time. Implemented in DepthLab: Yes.

environment according to the depth map. Unlike edge detection in a color image, highlighting depth edges may offer a clean segmentation of physical objects regardless of their Implemented in DepthLab: Yes.

22. Depth-based segmentation: Segment the foreground, background, or objects between a certain range of depth values from the color image. It may be useful for telecon-Implemented in DepthLab: Yes.



ed ASCII code into g purposes,

e screen to catch

ce-dimensional

in-painting:

son blending

lepth data:

ense depth

round pix-

epthLah

lels [7]:

would

ive of

35. Enable multitouch on surfaces [12]: User may annotate Enable multiouch on surfaces [12]: User may annotate sicky notes and papers with a pen and "pogram" them to control smart lights, music, and other digital functions of the annotations. vn virtual avatars e user may look

36. Person capture: Enable self-scanning with the frontal cam-37. AR board game: Design an AR-based board game [2] that aages (3D pho. As board game: Jesign an As-based board game 1/21 that overlays digital assets upon physical cards with aware of actions, and actions.

n of the mobile 38. Interactive surface editing: Apply simple 3D distortion for the surface based to constrain a calculation of the surface of

. Interpetive surface entiting: Apply simple 3D distortion (pinch, fwist, taper, bend) to captured colored voxels of the obviscal environment [4]. Interactive music experience: Design in air instruments

Interactive music experience: Design in-air instruments (guitar, piano) with dynamic gesture recognition [8]. Virtual and the state of (guine, piano) with dynamic gesture recognition [8]. Virtual rages are placed in 3D space, such as a drum set, big plano largets are placed in 3D space, such as a drum set, big piano keys, etc. Upon contact detection, the app plays a sound. REFERENCES

REFERENCES

(1) Karan Ahuja, Chris Harrison, Mayank Goel, and Robert

Vine 2010 Marchae, White Double Printeration for Karan Ahija, Chris Harrison, Mayank Goel, and Robert Xiao, 2019. McCap: Whole-Body Digitization for Cont V R/AR Headeds: In Proceedings of the 22Nd Lone Ost YR/AK Heausets. In Proceedings of the 32/ Annual ACM Symposium on User Interface Software Annua ACM Symposium on User Interface Software on Technology (UST '19), ACM, ACM, New York, 154, 454, 454, 2011.

http://dx.doi.org/10.1145/3332165.3347889 [2] Trocks L Andersen, Sune Kristensen, Bjørn W Nielsen, Troels L Andersen, Sune Kristensen, Bjørn W Niets and Kaj Grunbæk. 2004. Designing an augmented

and Kaj Grunbæk. 2014. Designing an augmented ceality board game with children: the bathelboard 3D constant of the property of reality board game with children: the battleboard 3D conference. In Proceedings of the 2004 conference on the conference experience. In Proceedings of the 2014 conference on Interaction design and children: building a community.

[3] Sujal Bista, Learo Line Leitao da Cunha, and Amitabh Line, hang 2017. Kinsadar Phasola Travanac. Elevable. Sujal Bisia, Icaro Lins Leuao da Cunha, and Amur Warshney. 2017. Kinetic Depth Images: Flexible Varshney. 2017. Kmetic Depth Images: Flexible Generation of Depth Perception. The Visual Computer 2 In (II) October 2017; 1387–1360 33, 10 (01 October 2017), 1357–1369.

[4] Ming Chuang and Michael Kazhdan, 2011. Interactive Anting chuang and Michael Kazhuan. 2011. Interactive and anisotropic geometry processing using the servened conson equation. In ACM SIGGRAPH 2011 papers.

[5] Ruofei Du, Eric Turner, Max Dzitsiuk. Luca Pe

Supplementary Material for DepthLab: Real-time 3D Interaction with Depth Maps for Mobile Augmented Reality

Ruofei Du, Eric Turner, Maksym Dzitsiuk, Luca Prasso, Ivo Duarte, Jason Dourgarian, Joao Afonso, Jose Pascoal, Josh Gladstone, Nuno Cruces, Shahram Izadi, Adarsh Kowdle,

5. Collision-aware placement: Test if a virtual object's vol-

sions and discuss their depth representation requirements, use cases, and whether each is implemented in DepthLab [5]. Note cases, and whether each is imprenented in Department [4]. Note that ideas 9, 21, 24, 25 are not available as open source code yet, but can be easily reproduced with the provided algorithms.

In this section, we list all ideas from our brainstorming ses-

GEOMETRY-AWARE AR FEATURES

Depth Representation Requirement: Localized Depth



Figure 1. Implementation examples of geometry-aware AR features 1-5 with bealized depth use cases. Please refer to the supplementary video

1. 3D oriented cursor: Render a 3D cursor centered in the screen center. The 3D cursor should change its orientation and scale according to the surface normal and distance when moving along physical surfaces. Implemented in DepthLab: Yes.

Brades e vietual laser from the user to

4. Avatar path planning: Navigate a virtual object to move naturally between two points in physical environments. Implemented in DepthLab: Yes.

ume collides with observed environment surfaces. Implemented in DepthLab: Yes.

Depth Representation Requirement: Surface Depth

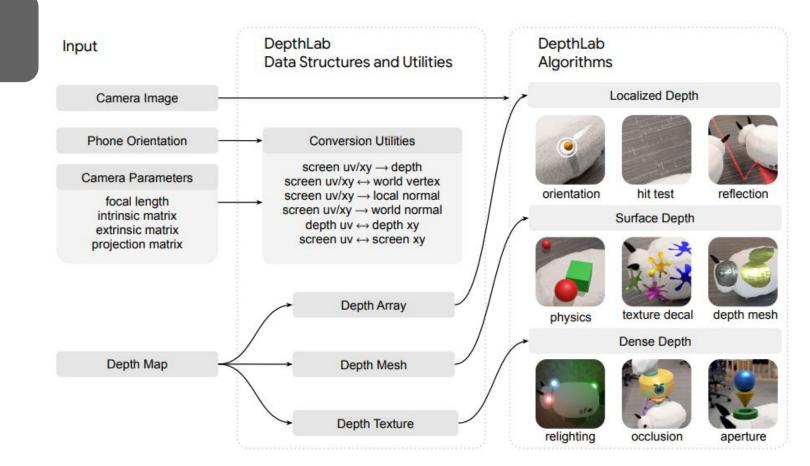


Figure 2. Implementation examples of geometry-aware AR features 6-3,

Virtual shadows: Render geometry-aware shadows [11] that are cast onto physical surfaces. The shadow may be is one physical surfaces. The shadow may be

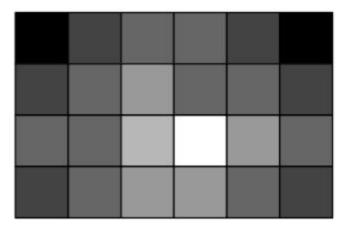
System

Architecture overview



Data Structure

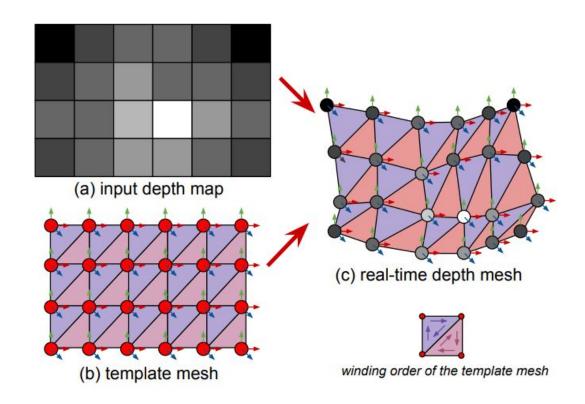
Depth Array



2D array (160x120 and above) of 16-bit integers

Data Structure

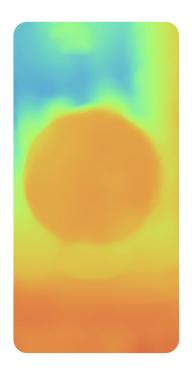
Depth Mesh



Data Structure

Depth Texture





System Architecture

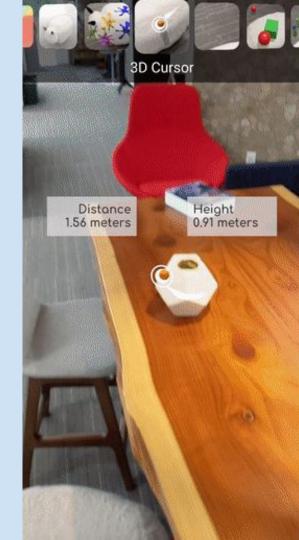
	Localized Depth	Surface Depth	Dense Depth
CPU	/	/	X (non-real-time)
GPU	N/A	√ (compute shader)	√ (fragment shader)
Prerequisite	point projection normal estimation	depth mesh triplanar mapping	anti-aliasing multi-pass rendering
Data Structure	depth array	depth mesh	depth texture
Example Use Cases	physical measure oriented 3D cursor path planning	collision & physics virtual shadows texture decals	scene relighting aperture effects occluded objects

Localized Depth

Coordinate System Conversion

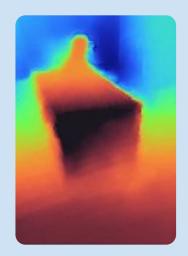
Conversion Utilities

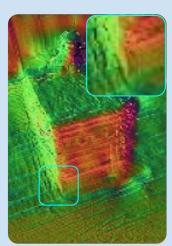
screen uv/xy → depth screen uv/xy ↔ world vertex screen uv/xy → local normal screen uv/xy → world normal depth uv ↔ depth xy screen uv ↔ screen xy



Localized Depth Normal Estimation

$$\mathbf{n_p} = \left(\mathbf{v_p} - \mathbf{v_{p+(1,0)}}\right) \times \left(\mathbf{v_p} - \mathbf{v_{p+(0,1)}}\right)$$



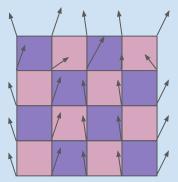


Localized Depth

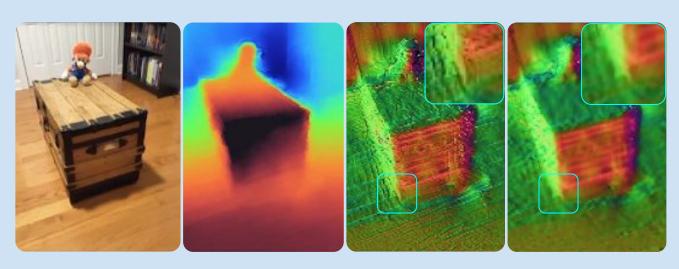
Normal Estimation

Algorithm 1: Estimation of the Normal Vector of a Screen Point in DepthLab.

```
Input: A screen point \mathbf{p} \leftarrow (x, y) and focal length f.
    Output: The estimated normal vector n.
  1 Set the sample radius: r \leftarrow 2 pixels.
  2 Initialize the counts along two axes: c_X \leftarrow 0, c_Y \leftarrow 0.
  3 Initialize the correlation along two axes: \rho_X \leftarrow 0, \rho_Y \leftarrow 0.
  4 for \Delta x \in [-r, r] do
          for \Delta y \in [-r, r] do
                Continue if \Delta x = 0 and \Delta y = 0.
                Set neighbor's coordinates: \mathbf{q} \leftarrow [x + \Delta x, y + \Delta y].
                Set q's distance in depth: d_{pq} \leftarrow ||\mathbf{D}(\mathbf{p}), \mathbf{D}(\mathbf{q})||.
                Continue if d_{pq} = 0.
                if \Delta x \neq 0 then
10
                      c_X \leftarrow c_X + 1.
11
                      \rho_X \leftarrow \rho_X + d_{pq}/\Delta x.
12
                end
13
                if \Delta y \neq 0 then
14
                      c_Y \leftarrow c_Y + 1.
15
                     \rho_Y \leftarrow \rho_Y + d_{pq}/\Delta y.
16
                end
17
 18
          end
19 end
20 Set pixel size: \lambda \leftarrow \frac{\mathbf{D}(\mathbf{p})}{f}.
21 return the normal vector n: \left(-\frac{\rho_Y}{\lambda c_Y}, -\frac{\rho_X}{\lambda c_X}, -1\right).
```



Localized Depth Normal Estimation





Localized Depth Avatar Path Planning





Localized Depth Rain and Snow

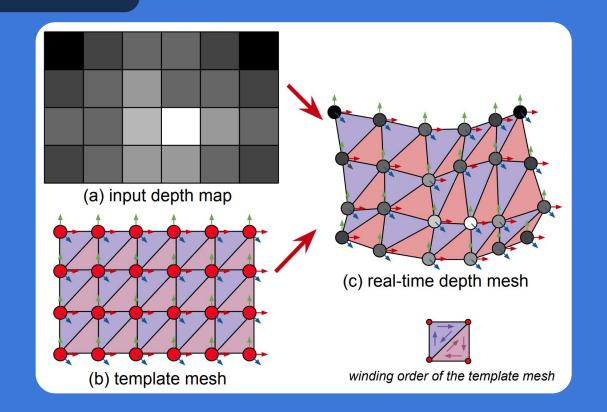






Surface Depth

Use Cases





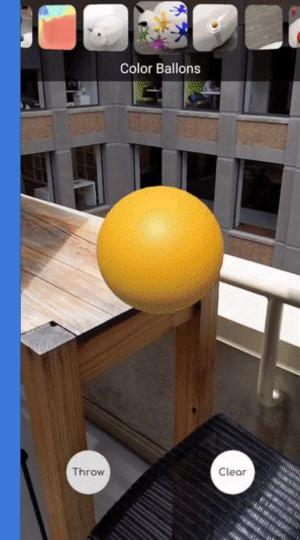


Physics with depth mesh.





Texture decals with depth mesh.

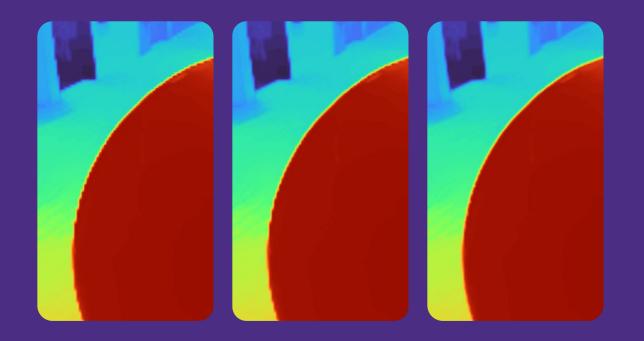


Surface Depth
3D Photo

Projection mapping with depth mesh.

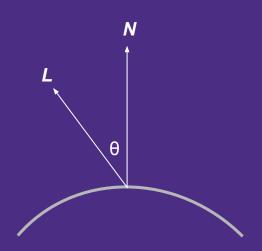


Dense Depth Depth Texture - Antialiasing





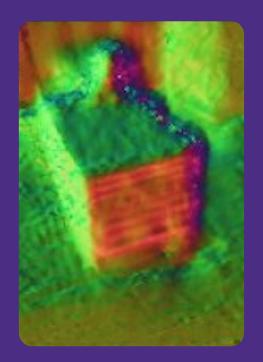
Dense Depth

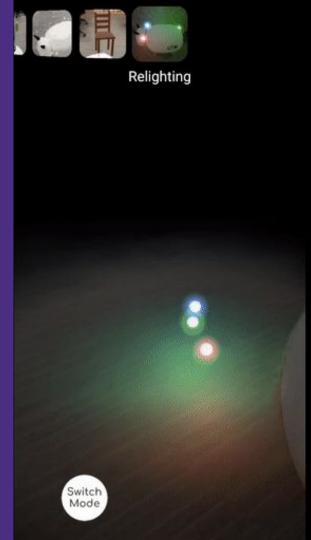




Dense Depth Why normal map does not

work?

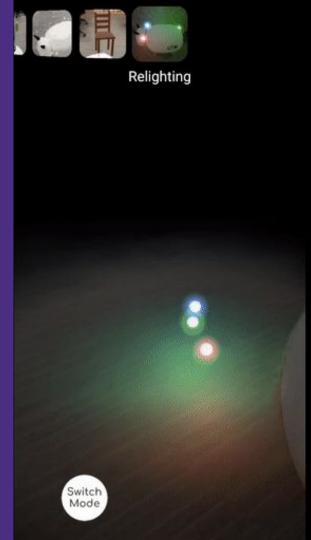




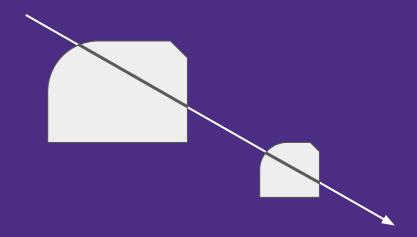
Dense Depth

Real-time relighting

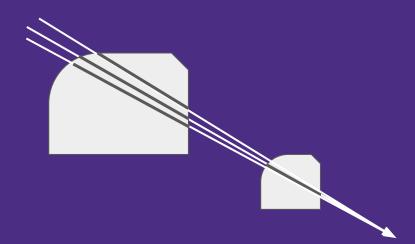
```
Algorithm 3: Ray-marching-based Real-time Relighting.
     Input: Depth map D, the camera image I, camera intrinsic
                   matrix K, L light sources \mathbb{L} = \{ \mathcal{L}^i, i \in L \} with each
                   light's location \mathbf{v}_{\varphi} and intensity in RGB channels
    Output: Relighted image O.
 1 for each image pixel \mathbf{p} \in depth \ map \ \mathbf{D} in parallel do
           Sample p's depth value d \leftarrow \mathbf{D}(\mathbf{p}).
          Compute the corresponding 3D vertex \mathbf{v_p} of the screen
            point p using the camera intrinsic matrix \mathbf{v}_{\mathbf{p}} with K:
            \mathbf{v}_{\mathbf{p}} = \mathbf{D}(\mathbf{p}) \cdot \mathbf{K}^{-1}[\mathbf{p}, 1]
           Initialize relighting coefficients of \mathbf{v_p} in RGB: \phi_{\mathbf{p}} \leftarrow \mathbf{0}.
          for each light \mathcal{L} \in light sources \mathbb{L} \hat{\mathbf{do}}
                 Set the current photon coordinates \mathbf{v}_o \leftarrow \mathbf{v}_{\mathbf{n}}.
 6
                 Set the current photon energy E_o \leftarrow 1.
                 while \mathbf{v}_o \neq \mathbf{v} \varphi do
                       Compute the weighted distance between the
                         photon to the physical environment
                         \Delta d \leftarrow \alpha |\mathbf{v}_o^{xy} - \mathbf{v}_{\mathscr{L}}^{xy}| + (1 - \alpha)|\mathbf{v}_o^z - \mathbf{v}_{\mathscr{L}}^z|, \ \alpha = 0.5.
                       Decay the photon energy: E_o \leftarrow 95\%E_o
10
                       Accumulate the relighting coefficients:
11
                         \phi_{\mathbf{p}} \leftarrow \phi_{\mathbf{p}} + \Delta dE_o \phi_{\mathcal{L}}.
                       March the photon towards the light source:
12
                         \mathbf{v}_o \leftarrow \mathbf{v}_o + (\mathbf{v}_{\mathscr{L}} - \mathbf{v}_o)/S, here S = 10, depending
                         on the mobile computing budget.
13
                 end
14
15
          Sample pixel's original color: \Phi_{\mathbf{p}} \leftarrow \mathbf{I}(\mathbf{p}).
           Apply relighting effect:
            \mathbf{O}(\mathbf{p}) \leftarrow \gamma \cdot |\mathbf{0.5} - \phi_{\mathbf{p}}| \cdot \Phi_{\mathbf{p}}^{\mathbf{1.5} - \phi_{\mathbf{p}}} - \Phi_{\mathbf{p}}, here \gamma \leftarrow 3.
17 end
```



Dense Depth Real-time relighting



Dense Depth Real-time relighting





go/realtime-relighting, go/relit



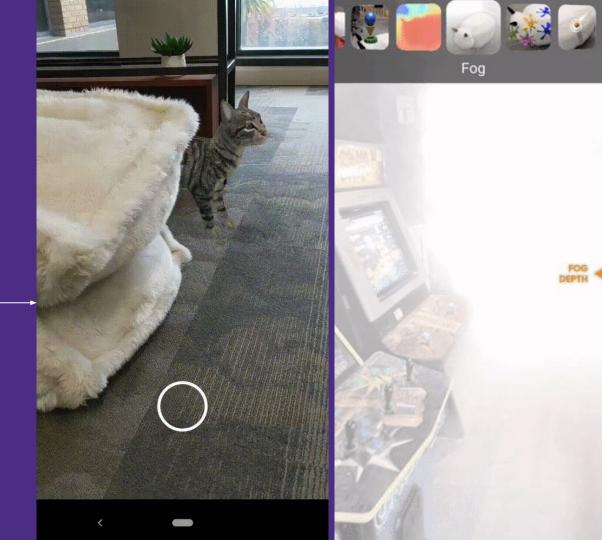
Dense Depth Wide-aperture effect



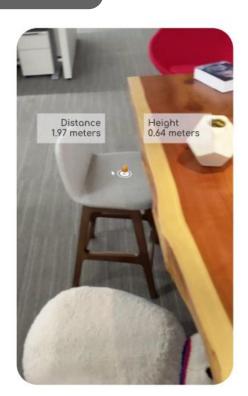


Dense Depth Occlusion-based rendering

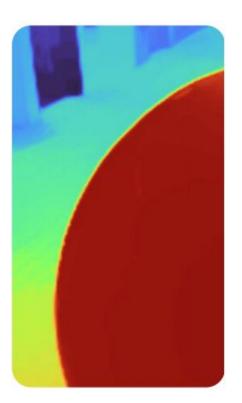




Experiments DepthLab minimum viable



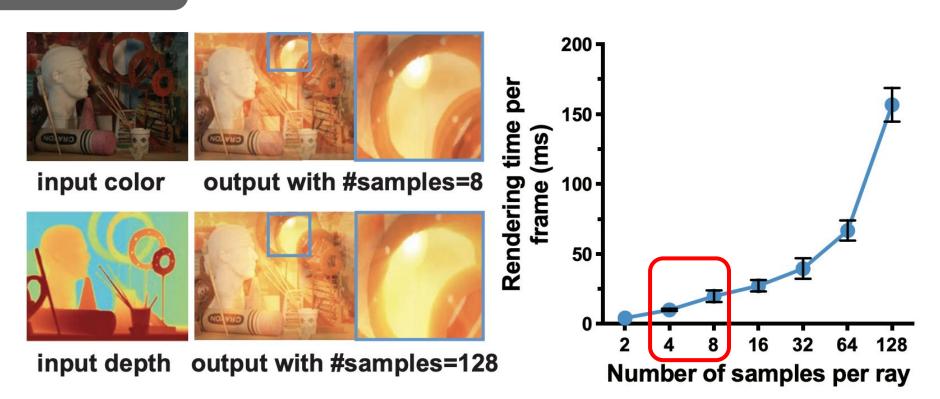




Procedure	Timings (ms)
DepthLab's overall processing and rendering in Unity	8.32
DepthLab's data structure update and GPU uploading	1.63
Point Depth: normal estimation algorithm	< 0.01
Surface Depth: depth mesh update algorithm	2.41
Per-pixel Depth: visualization with single texture fetch	0.32

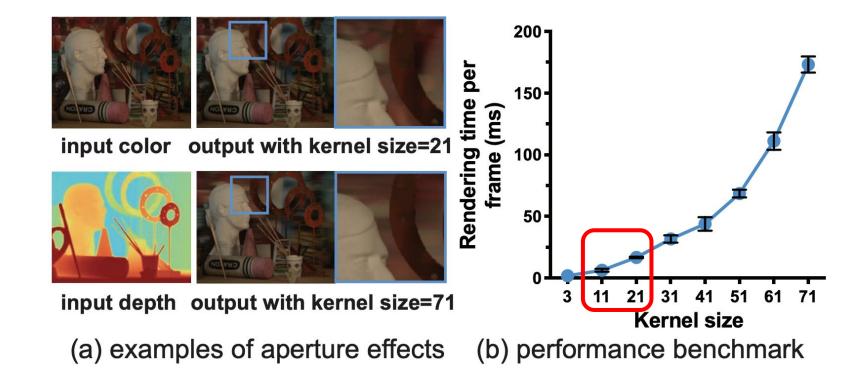
Experiments

Relighting



Experiments

Aperture effects



Discussion

Deployment with partner







Discussion

Deployment with partner







Discussion

Deployment with partners



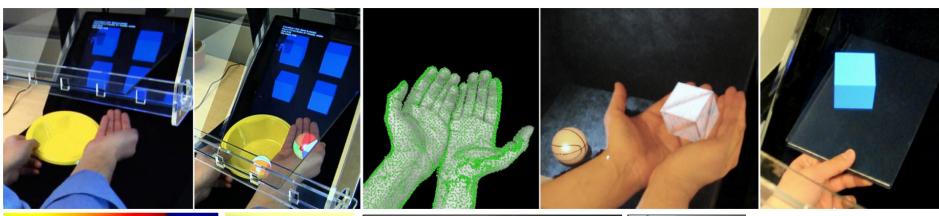


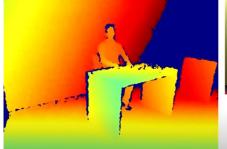


Limitations

Design space of dynamic depth

Dynamic Depth? HoloDesk, HyperDepth, Digits, Holoportation for mobile AR?







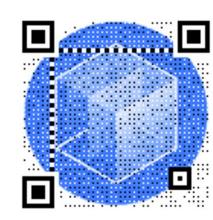


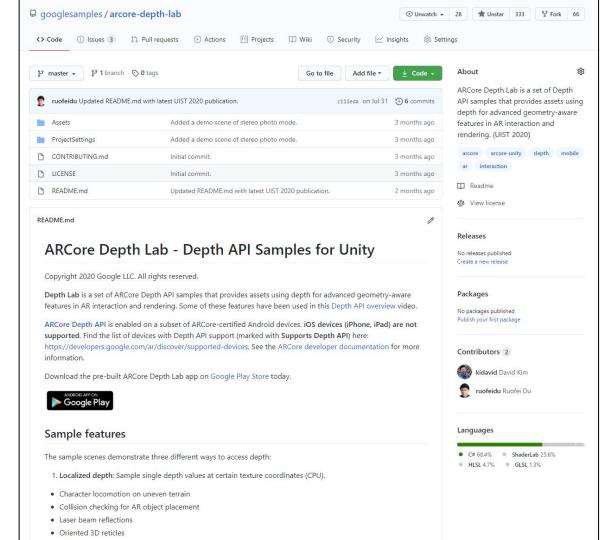






GitHub Please feel free to fork!





Play Store

Try it yourself!





ARCore Depth Lab

Google Samples Tools

E Everyone

A You don't have any devices.



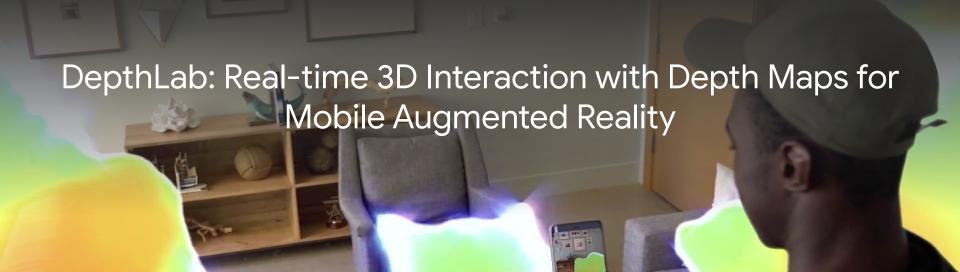
Installed











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Thank you!



DEPTHLAB: REAL-TIME 3D INTERACTION WITH DEPTH MAPS FOR MOBILE AUGMENTED REALITY

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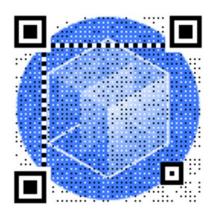








Demo DepthLab | UIST 2020



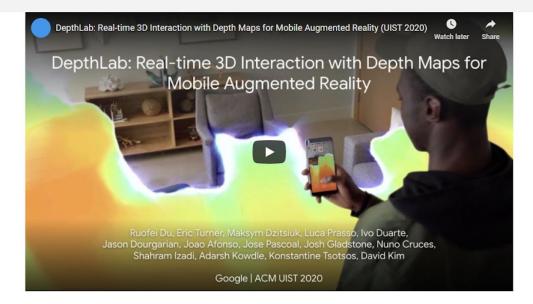
DEPTHLAB: REAL-TIME 3D INTERACTION WITH DEPTH MAPS FOR MOBILE AUGMENTED REALITY

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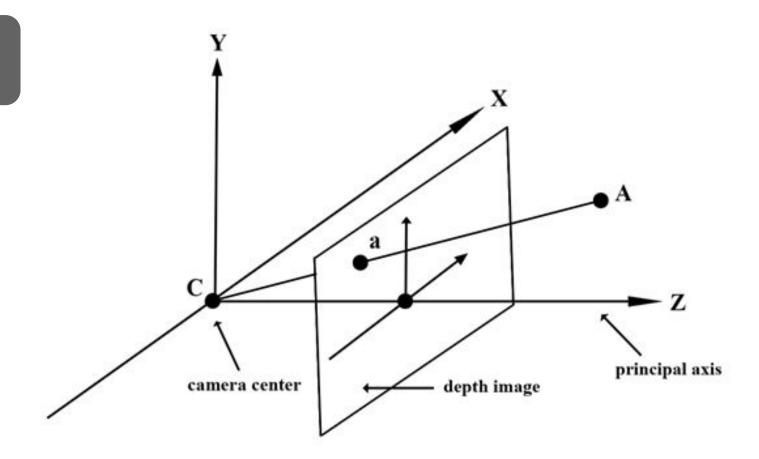






Introduction

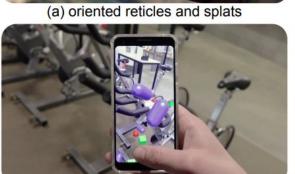
Depth Map



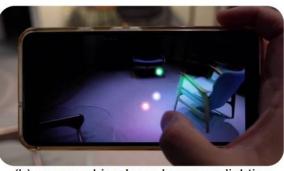
Introduction

Depth Lab





(d) geometry-aware collisions



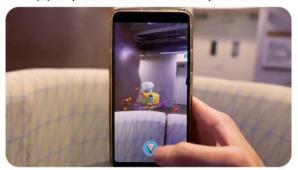
(b) ray-marching-based scene relighting



(e) 3D-anchored focus and aperture effect



(c) depth visualization and particles



(f) occlusion and path planning

Thank you!





DepthLab: Real-Time 3D Interaction With Depth Maps for Mobile Augmented Reality

Ruofei Du, Eric Turner, Maksym Dzitsiuk, Luca Prasso, Ivo Duarte, Jason Dourgarian, Joao Afonso, Jose Pascoal, Josh Gladstone, Nuno Cruces, Shahram Izadi, Adarsh Kowdle, Konstantine Tsotsos, and David Kim Proceedings of the 33rd Annual ACM Symposium on User Interface Software and Technology (UIST), 2020.

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Occlusion is a critical component for AR realism!

Correct occlusion helps ground content in reality, and makes virtual objects feel as if they are actually in your space.

Introduction Motivation





Depth Mesh

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Algorithm 2: Real-time Depth Mesh Generation.
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Input: Depth map D, its dimension w \times h, and depth discontinuity threshold \Delta d_{\text{max}} = 0.5.
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Output: Lists of mesh vertices \mathbb{V} and indices \mathbb{I} .

In the initialization stage on the CPU:

1 **for** $x \in [0, w-1]$ **do**

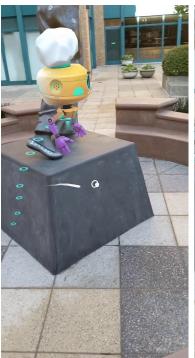
for $y \in [0, h-1]$ do

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Set the pivot index: I_0 \leftarrow y \cdot w + x.
               Set the neighboring indices:
                I_1 \leftarrow I_0 + 1, I_2 \leftarrow I_0 + w, I_3 \leftarrow I_2 + 1.
              Add the vertex (x/w, y/h, 0) to \mathbb{V}.
 5
         end
 7 end
    In the rendering stage on the CPU or GPU:
 8 for each vertex v \in \mathbb{V} do
         Look up v's corresponding screen point \mathbf{p}.
         Fetch v's depth value d_0 \leftarrow \mathbf{D}(\mathbf{p}).
10
         Fetch v's neighborhoods' depth values:
11
           d_1 \leftarrow \mathbf{D}(\mathbf{p} + (1,0)), d_2 \leftarrow \mathbf{D}(\mathbf{p} + (0,1)),
           d_3 \leftarrow \mathbf{D}(\mathbf{p} + (1,1)).
         Compute average depth \bar{d} \leftarrow \frac{d_0 + d_1 + d_2 + d_3}{4}.
12
         Let d \leftarrow [d_0, d_1, d_2, d_3].
13
         if any (step (\Delta d_{max}, |\boldsymbol{d} - \bar{d}|)) = 1 then
14
              Discard v due to large depth discontinuity.
15
         end
16
17 end
```

Localized Depth Avatar Path Planning



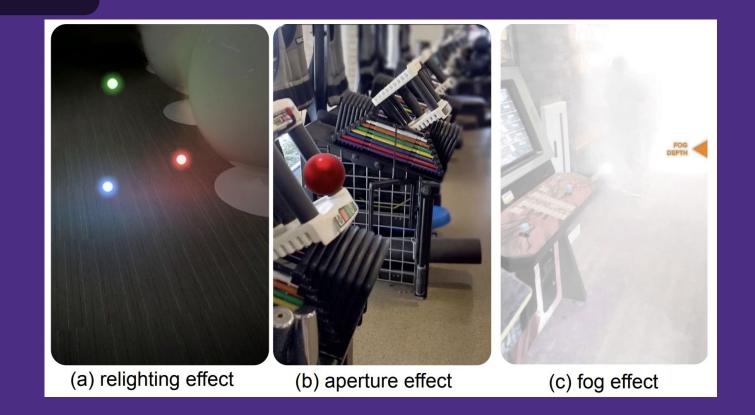






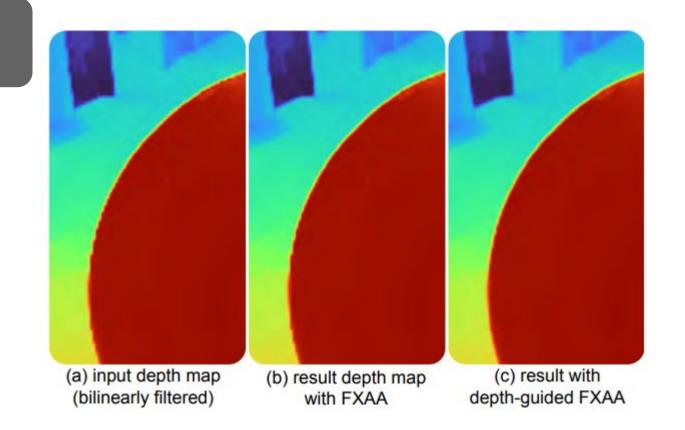


Dense Depth Depth Texture



Introduction

Depth Mar



Taxonomy Depth Usage

Depth-based Interaction Design Space		
Geometry-aware	Depth Interaction	Visual Effects of
Rendering	Interface	Static
occlusion shadows relighting	3D cursor bounding-box region selection 	Bokeh effect triplanar mapping aligned AR text
Actions	Gestures	Dynamic
physics path planning free-space check 	static hand dynamic motion 3D touch 	depth transition light painting surface ripples

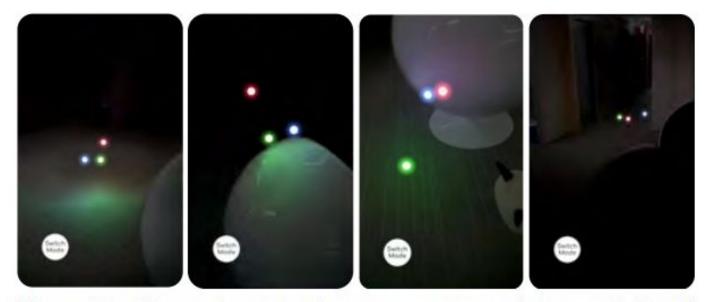


Figure 12. Given a dense depth texture, a camera image, and virtual light sources, we altered the lighting of the physical environment by tracing occlusions along the light rays in real time.

Introduction

Depth Map



Figure 13. Wide-aperture effect focused on a world-anchored point on a flower from different perspectives. Unlike traditional photography software, which only anchors the focal plane to a screen point, DepthLab allows users to anchor the focal point to a physical object and keep the object in focus from even when the viewpoint changes. Please zoom in to compare the focus and out-of-focus regions.