



GDC

# ***144FPS Rendering on Mobile: Frame Prediction in Arena Breakout***

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# **01** *Background*

Motivation

# **02** *Frame Prediction*

The implementation of frame prediction algorithm

# **03** *Rendering Pipelines*

The corresponding rendering pipelines with frame prediction

# **04** *Conclusion*

Analysis of performance and further applications

# **01** *Background*

## *Motivation*

## ***Situation***

- More and more mobile devices support high screen refresh rates (90, 120, 144Hz and higher)
- Players demand smoother experience without reducing the quality of graphics

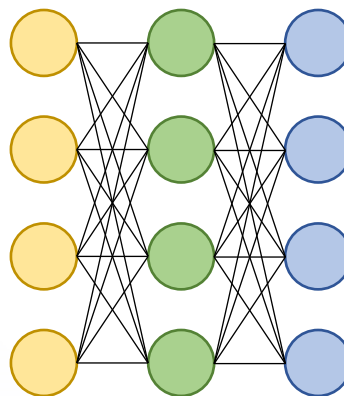
## ***Challenges***

- Conflict between graphics quality and frame rate: Higher graphic quality needs more rendering time, but it will reduce the frame rate
- Battery consumption and overheating



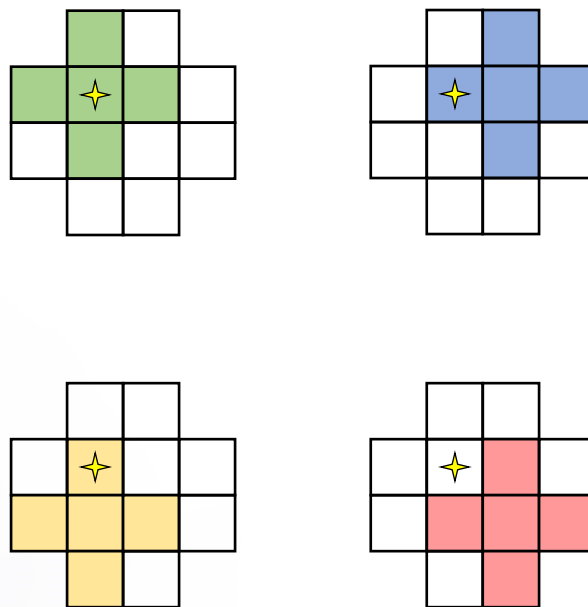
## Existing solutions?

- Deep learning based solution?
  - Specific hardware dependencies ✖
  - High cost and low response ✖



## Other solutions?

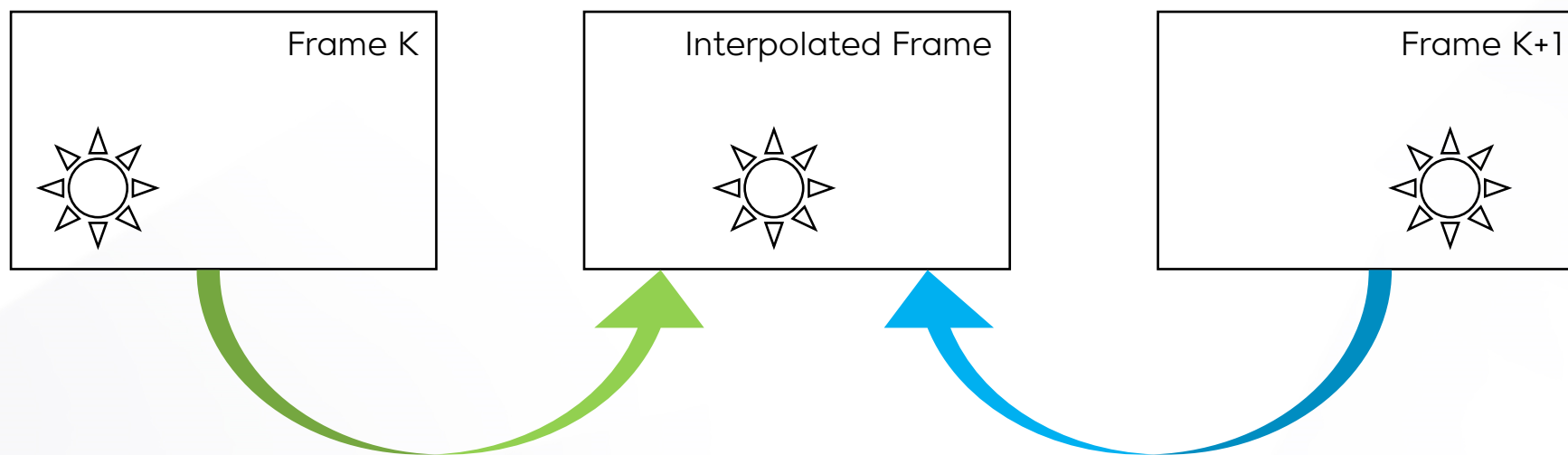
- Deep learning based solution ✖
- Software super-resolution?
  - High bandwidth cost (large number of neighborhood pixels sampling) ✖
  - Only a small increase in frame rate ✖



*Edge calculation for upsampling*

## Other solutions?

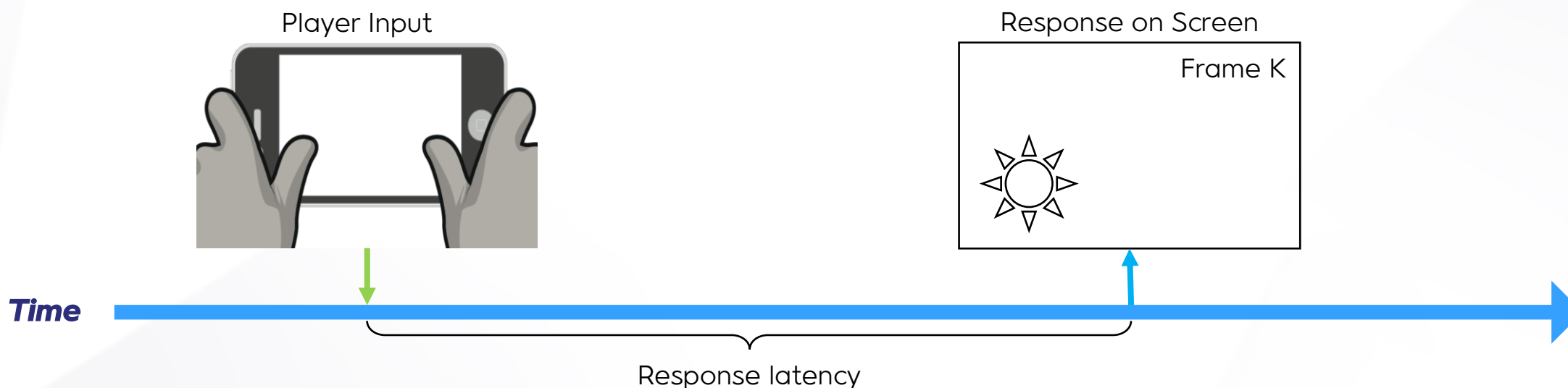
- Deep learning based solution ✖
- Software super-resolution ✖
- Frame interpolation?
  - Additional operation response latency ✖
  - Interpolation cost ✖



*Frame interpolation*

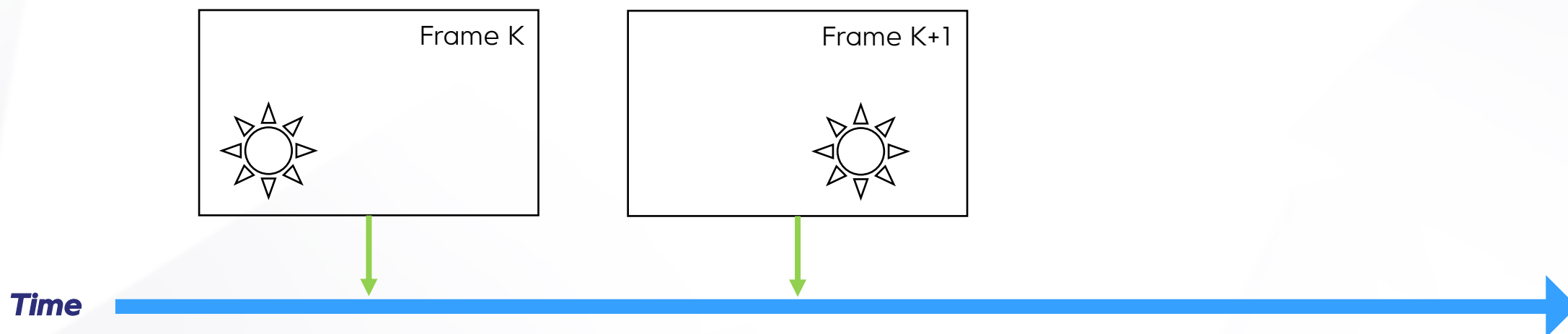
## Other solutions?

- Deep learning based solution ✕
- Software super-resolution ✕
- Frame interpolation?
  - Additional operation response latency ✕
  - Interpolation cost ✕



## Other solutions?

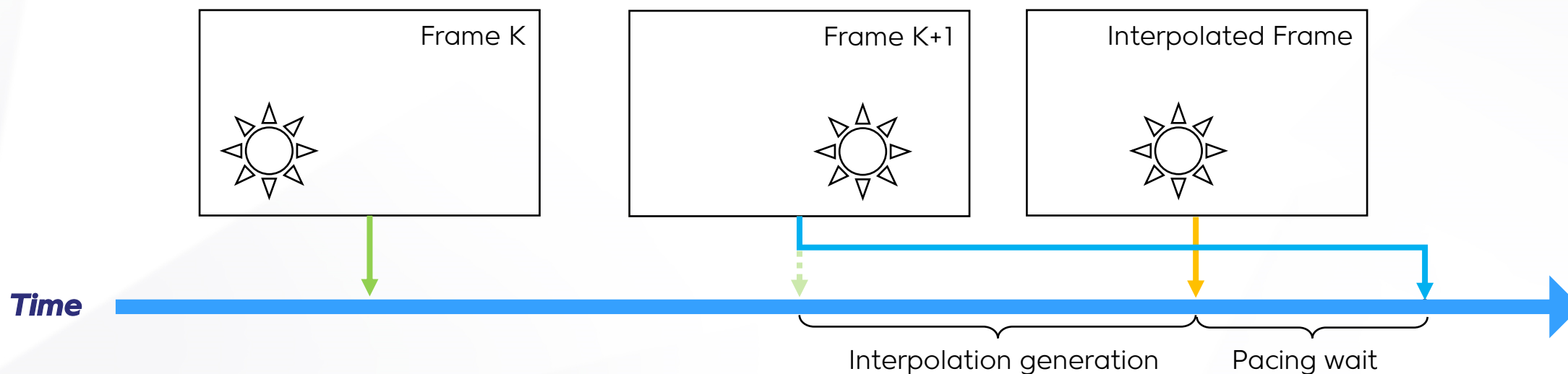
- Deep learning based solution ✖
- Software super-resolution ✖
- Frame interpolation?
  - Additional operation response latency ✖
  - Interpolation cost ✖



*Frame display without frame interpolation*

## Other solutions?

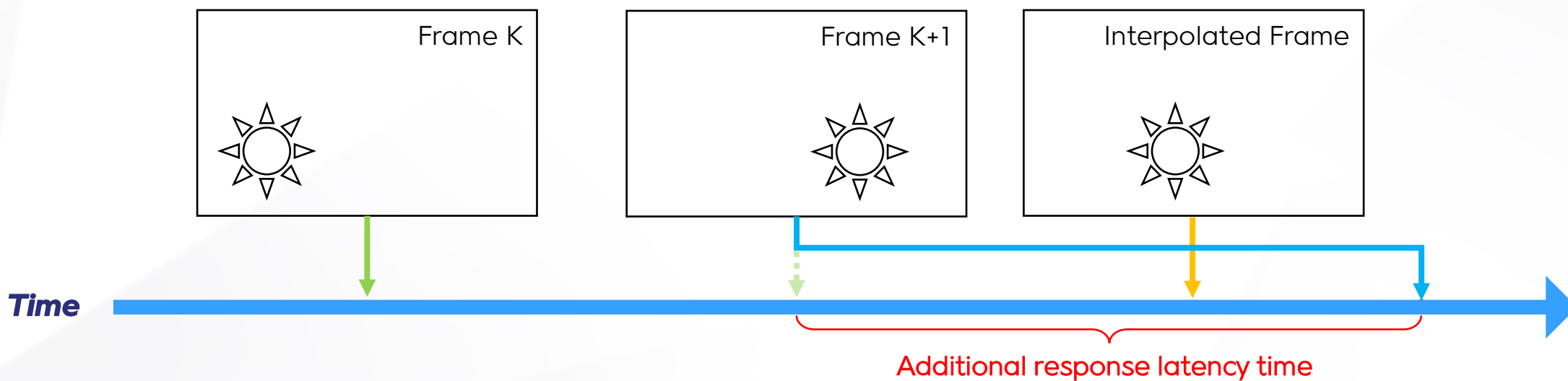
- Deep learning based solution ✕
- Software super-resolution ✕
- Frame interpolation?
  - Additional operation response latency ✕
  - Interpolation cost ✕



*Frame display with frame interpolation*

## Other solutions?

- Deep learning based solution ✕
- Software super-resolution ✕
- Frame interpolation?
  - Additional operation response latency ✕
  - Interpolation cost ✕



*Frame display with frame interpolation*

## **Requirement**

A solution is required to increase the frame rate on mobile devices. It should be:

- Simple, fast, no additional latency
- Robust
- Effective and efficient
- Highly compatible (no specific hardware dependence)



# **02** *Frame Prediction*

*The implementation of frame prediction algorithm*

## Key idea

- Reusing the rendered pixels from the previous frame!
  - Predicted frame = previous frame + gameplay info



*Most of rendered pixels from previous frame are reusable*



## Key idea

- Reusing the rendered pixels from the previous frame!
- Separate the rendering of dynamic and static objects
  - Motion of dynamic objects' pixels: complex and even unpredictable; needs segmentation
  - Pixels from static objects: can be easily reused through reprojection (majority of all pixels)



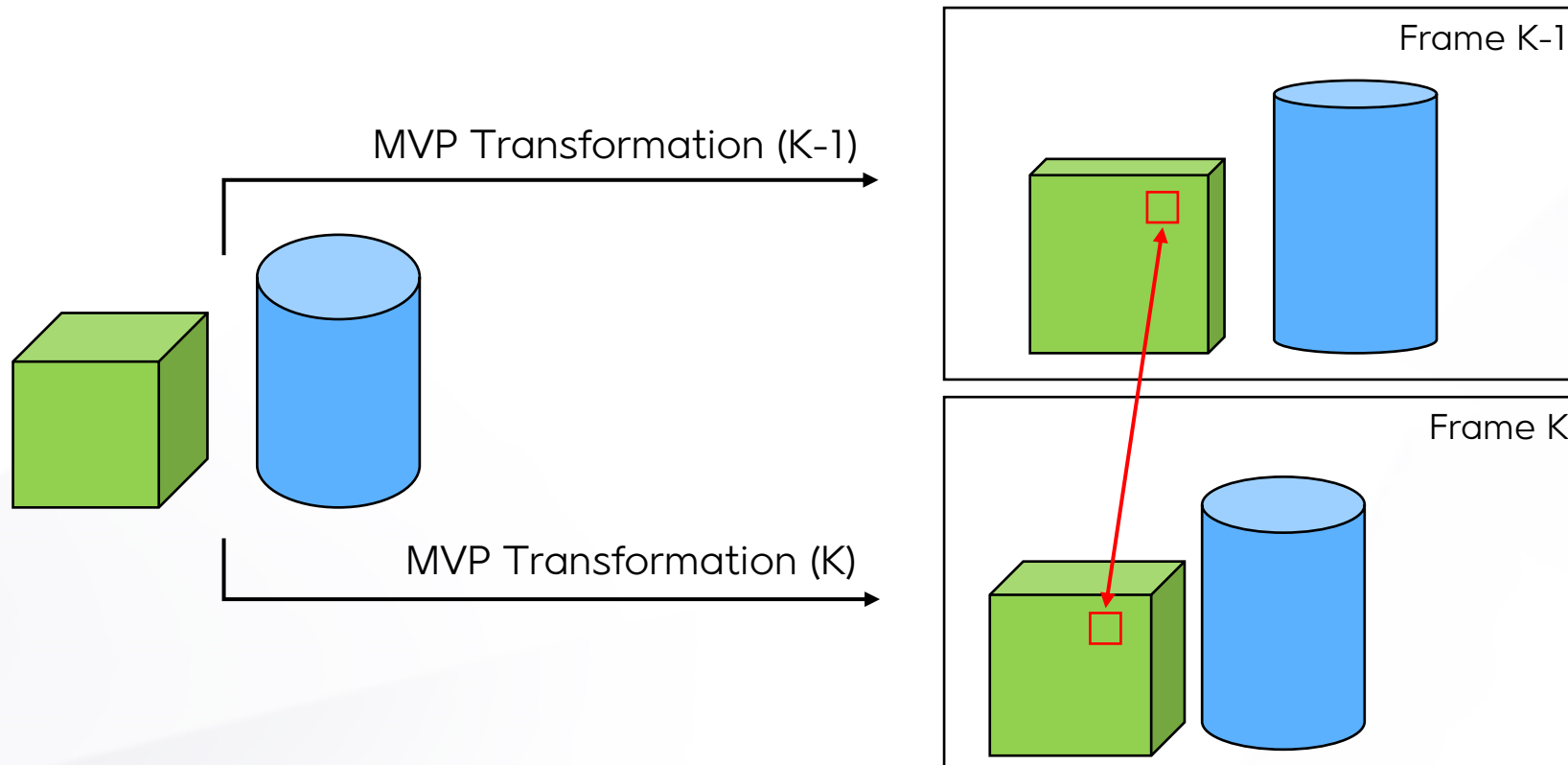
*Static objects*



*Static and dynamic objects*

## Finding Corresponding

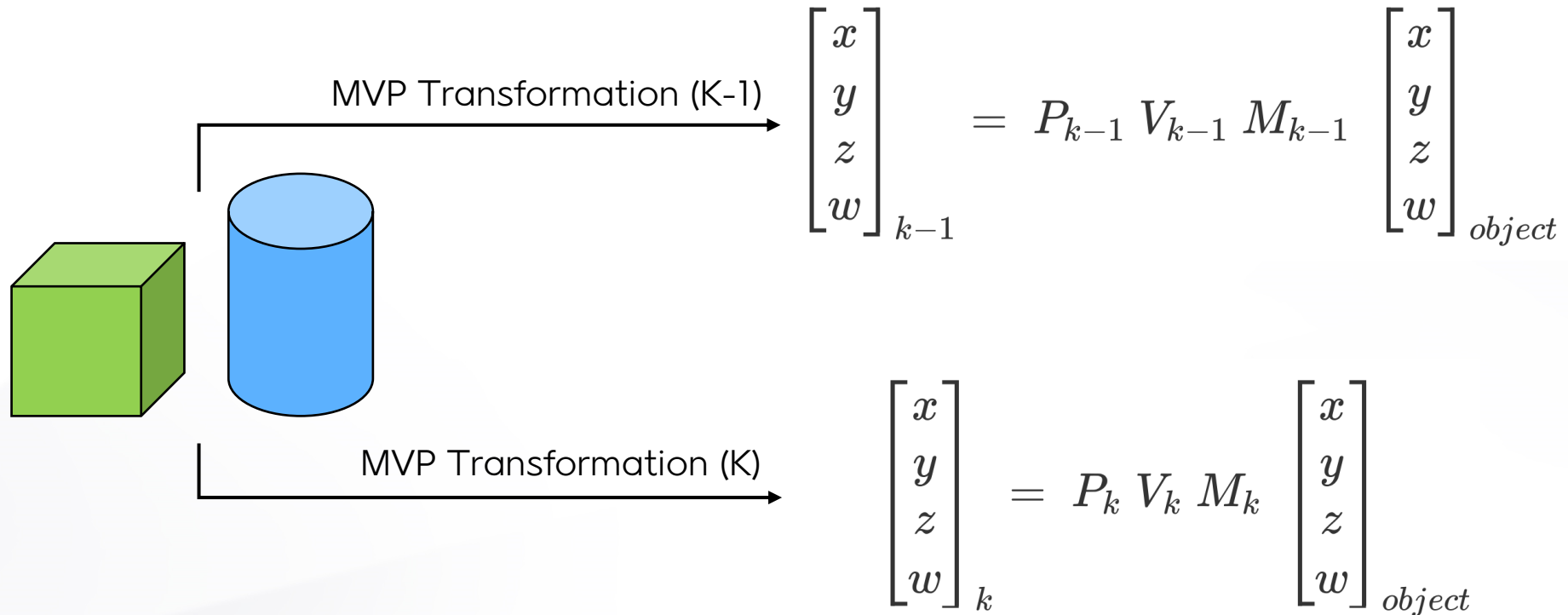
- Scene objects are transformed to screen projection plane by MVP Transformation
- Corresponding between frames can be established with reprojection



*MVP transformation in frames*

## Finding Corresponding

- Scene objects are transformed to screen projection plane by MVP Transformation
- Corresponding between frames can be established with reprojection

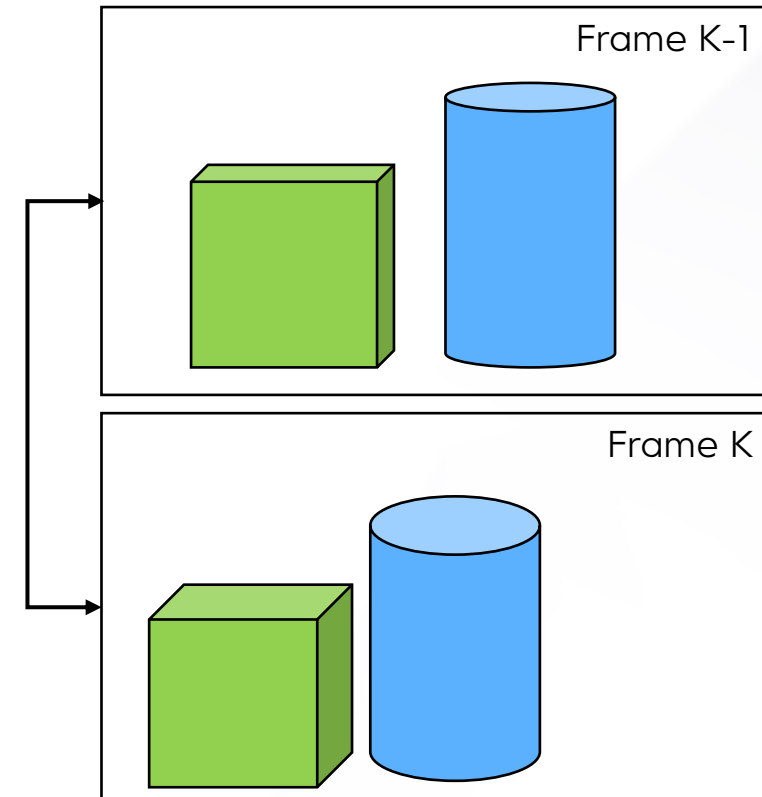


**MVP transformation in frames**

## Finding Corresponding

- Scene objects are transformed to screen projection plane by MVP Transformation
- Corresponding between frames can be established with reprojection

$$\begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_{k-1} = P_{k-1} V_{k-1} \underbrace{M_{k-1} M_k^{-1}}_{=I} V_k^{-1} P_k^{-1} \begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_k$$



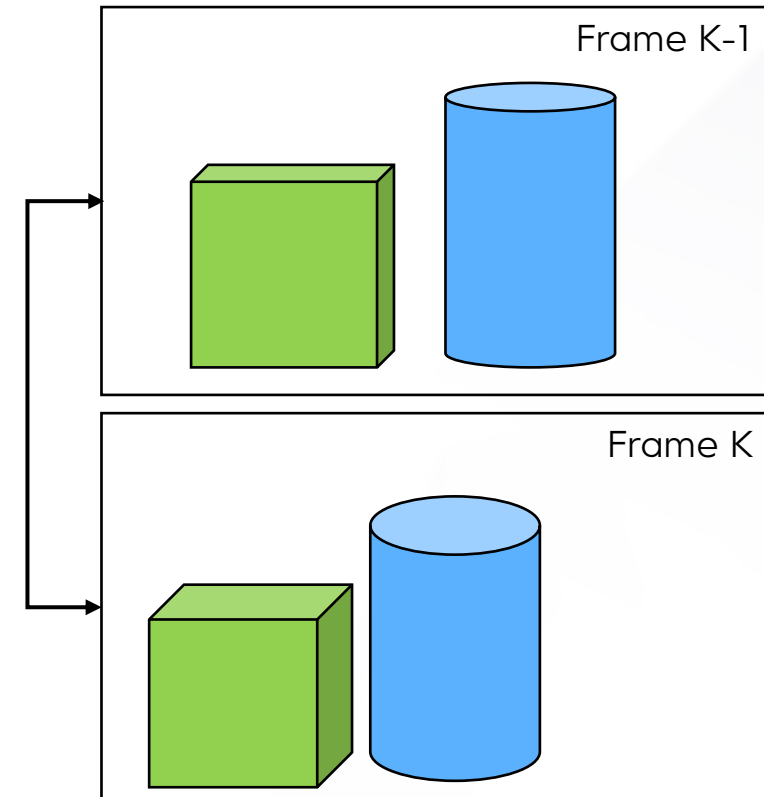
*Reprojection between frames*

## Finding Corresponding

- Scene objects are transformed to screen projection plane by MVP Transformation
- Corresponding between frames can be established with reprojection

$$\begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_{k-1} = \underbrace{P_{k-1} V_{k-1} M_{k-1} M_k^{-1} V_k^{-1} P_k^{-1}}_{= I} \begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_k$$

Reprojection matrix



Reprojection between frames



## Thinking

- Separate the rendering of dynamic and static objects
  - Motion of dynamic objects: complex and even unpredictable; needs segmentation
  - Static objects: can be easily reused by reprojection
- Per-pixel reprojection?
  - From frame k to frame k-1: missed z-component (depth) without rendering ✖

$$\begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_{k-1} = P_{k-1} V_{k-1} \underbrace{M_{k-1} M_k^{-1}}_{=I} V_k^{-1} P_k^{-1} \begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_k$$

The  $z$  component of the vector on the right is circled in red, with the word *None!* written in red next to it.

**Reprojection from frame k to frame k-1**



## Thinking

- Separate the rendering of dynamic and static objects
  - Motion of dynamic objects: complex and even unpredictable; needs segmentation
  - Static objects: can be easily reused by reprojection
- Per-pixel reprojection?
  - From frame k to frame k-1: missed z-component (depth) without rendering ✖

$$\begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_k = P_k V_k \underbrace{M_k M_{k-1}^{-1}}_{=I} V_{k-1}^{-1} P_{k-1}^{-1} \begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_{k-1}$$

*Reprojection from frame k-1 to frame k*



*Crack and overlap of per-pixel reprojection*





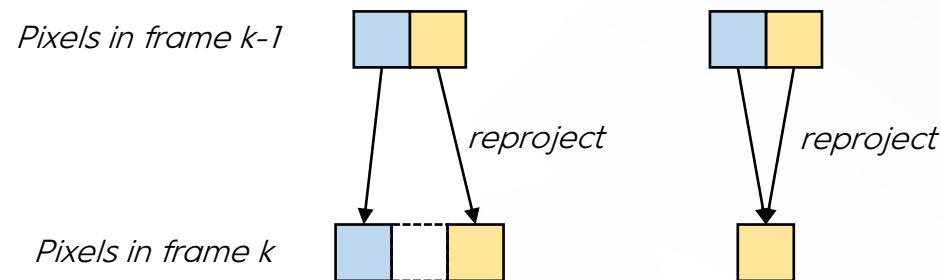
*Crack and overlap of per-pixel reprojection*

## Thinking

- Separate the rendering of dynamic and static objects
  - Motion of dynamic objects: complex and even unpredictable; needs segmentation
  - Static objects: can be easily reused by reprojection
- Per-pixel reprojection?
  - From frame k to frame k-1: missed z-component (depth) without rendering ✖
  - From frame k-1 to frame k: crack and overlap ✖

$$\begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_k = P_k V_k \underbrace{M_k M_{k-1}^{-1}}_{=I} V_{k-1}^{-1} P_{k-1}^{-1} \begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_{k-1}$$

**Reprojection from frame k-1 to frame k**

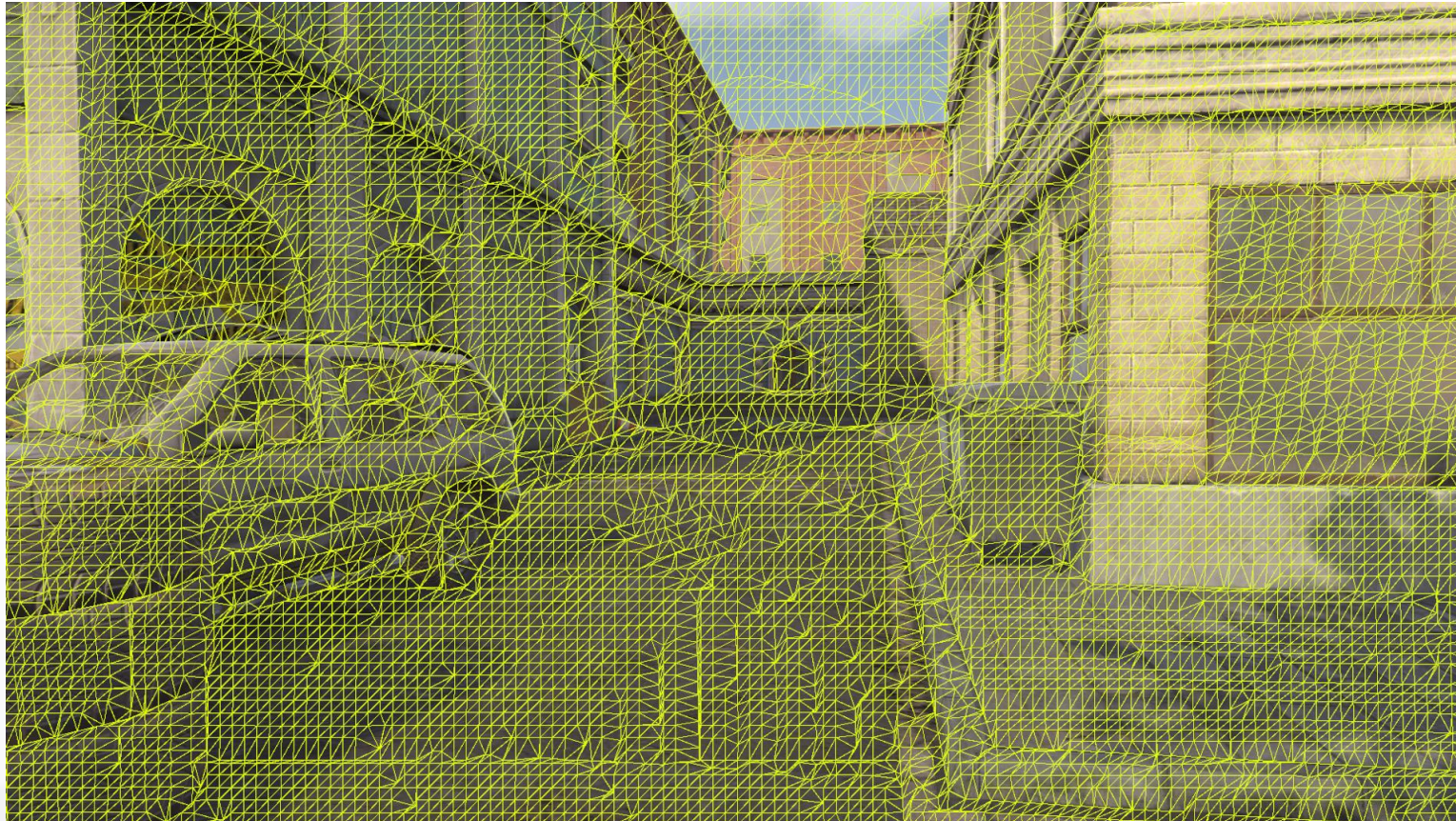


**Crack and overlap**



## ***Solution: per-vertex reprojection***

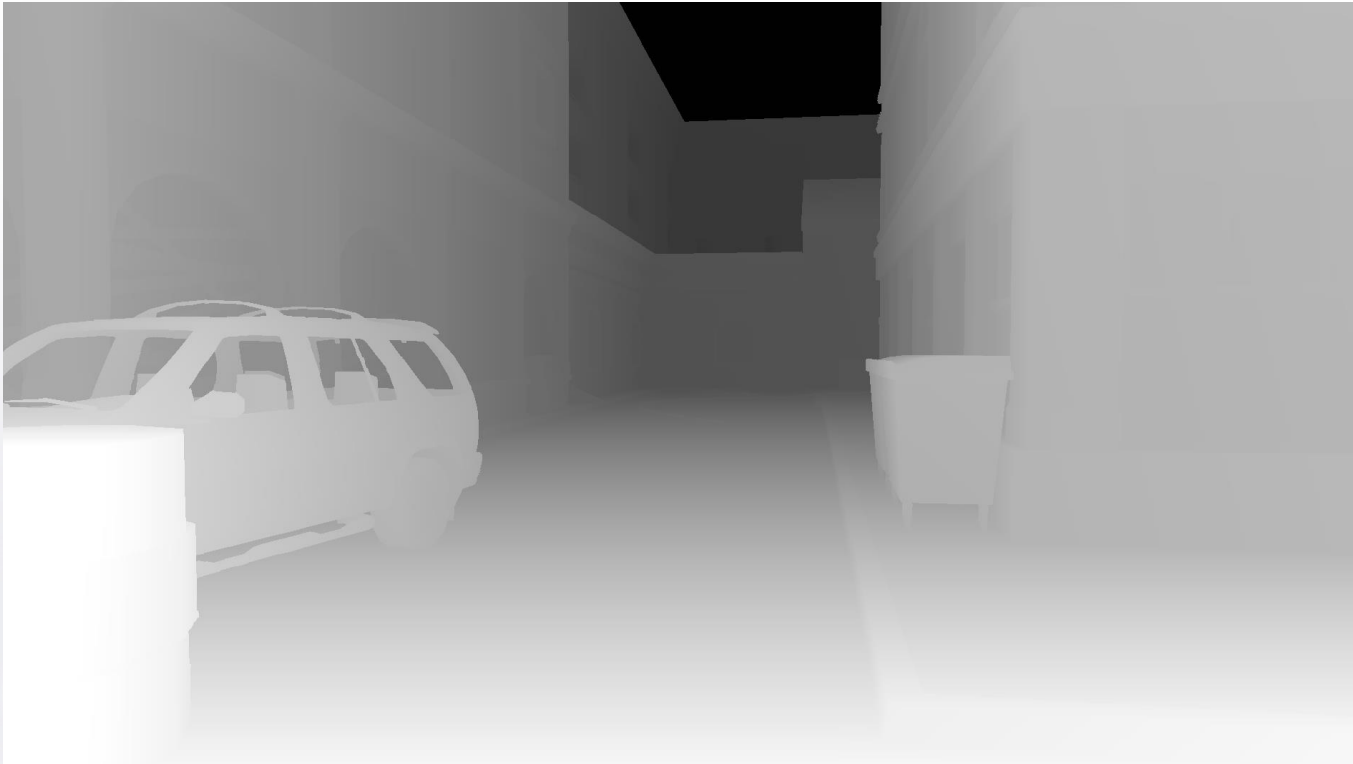
- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
- This algorithm is called *Mesh Projection Estimation* within the project team of Arena Breakout.



***Reconstructed mesh***

## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where the vertices are most likely to exist

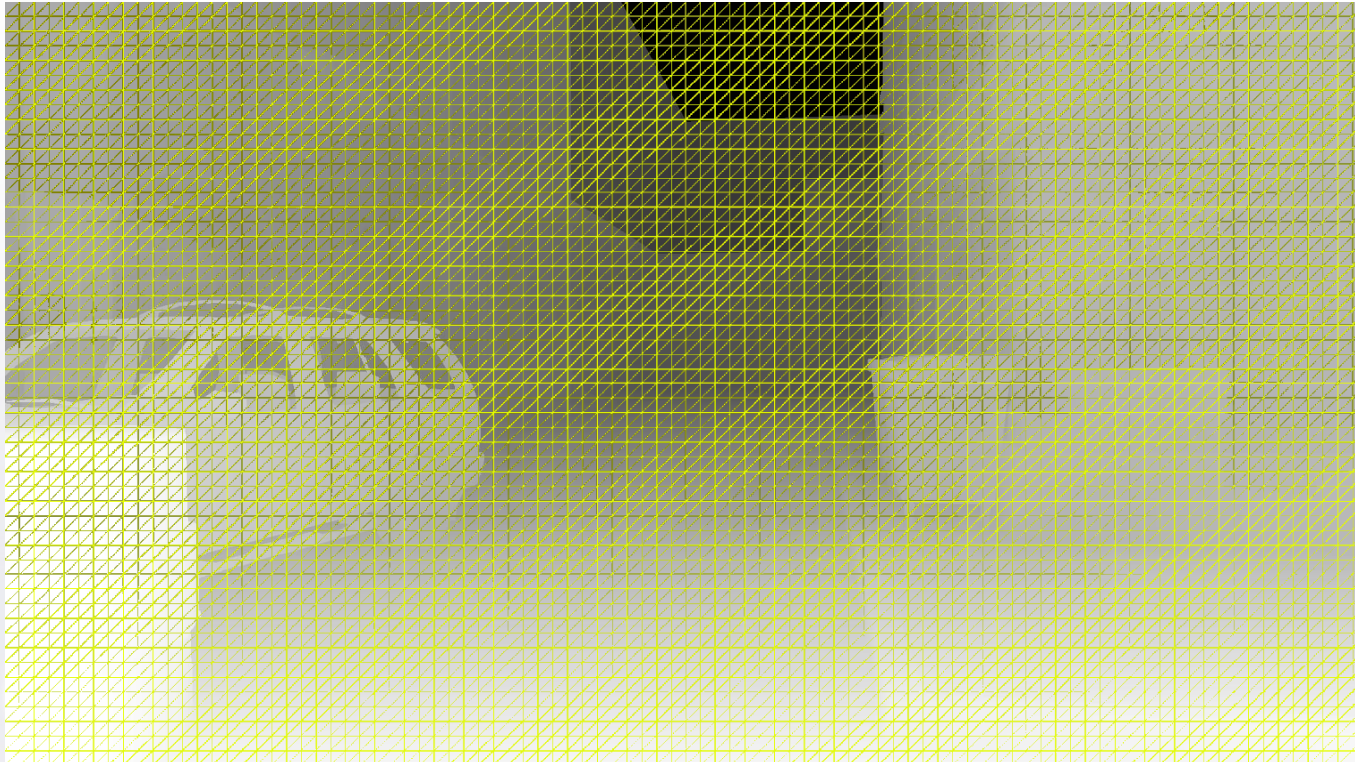


***Cached SceneDepth***



## ***Solution: per-vertex reprojection***

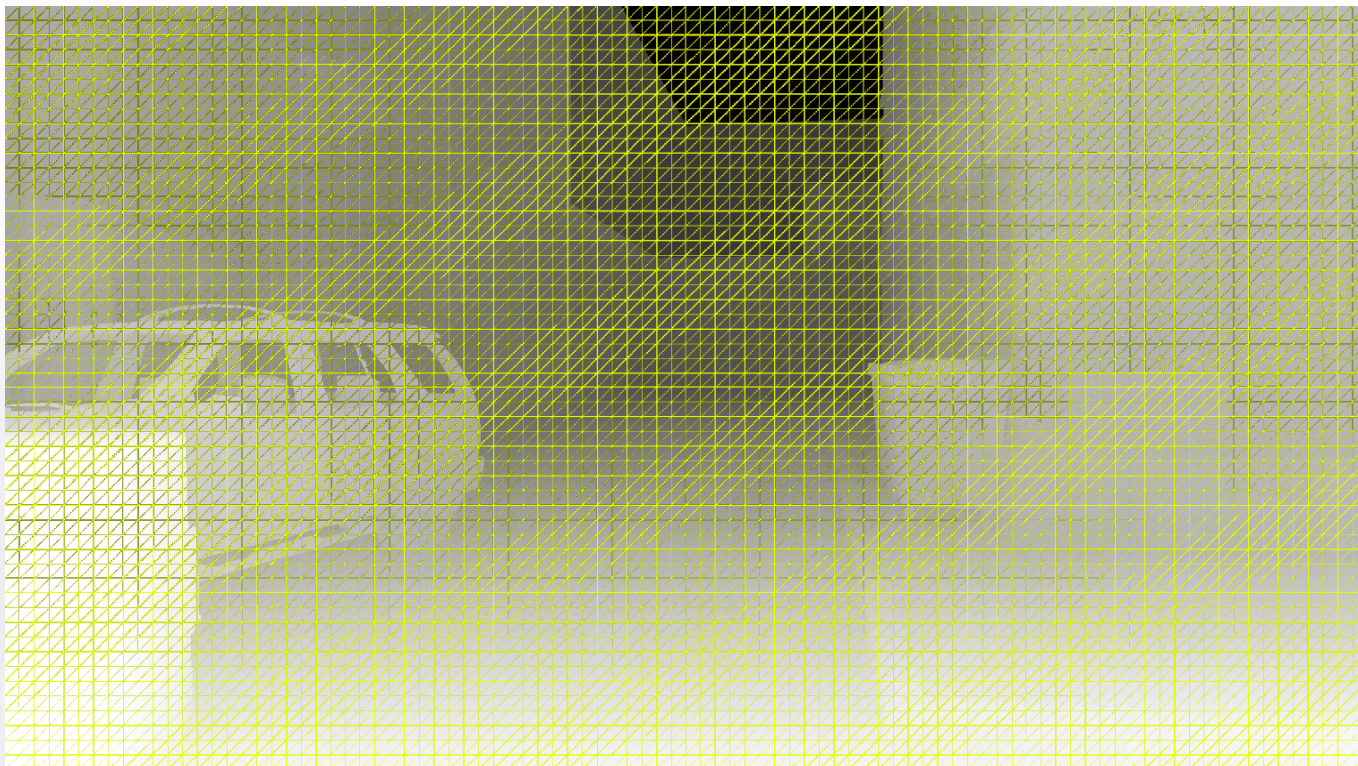
- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
    - Every  $n \times n$  pixels as a tile (with  $n$  between 8 and 16)



***Initial vertices state (upper left of Tile)***

## **Solution: per-vertex reprojection**

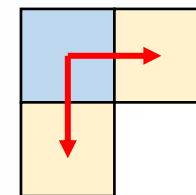
- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
    - Every  $n \times n$  pixels as a tile (with  $n$  between 8 and 16)
    - Search for the pixel with the maximum sum of squared gradients within tiles, which is considered the most likely location of the vertex.



**Initial vertices state (upper left of Tile)**

$$\left(\frac{\partial f}{\partial x}\right)^2 + \left(\frac{\partial f}{\partial y}\right)^2$$

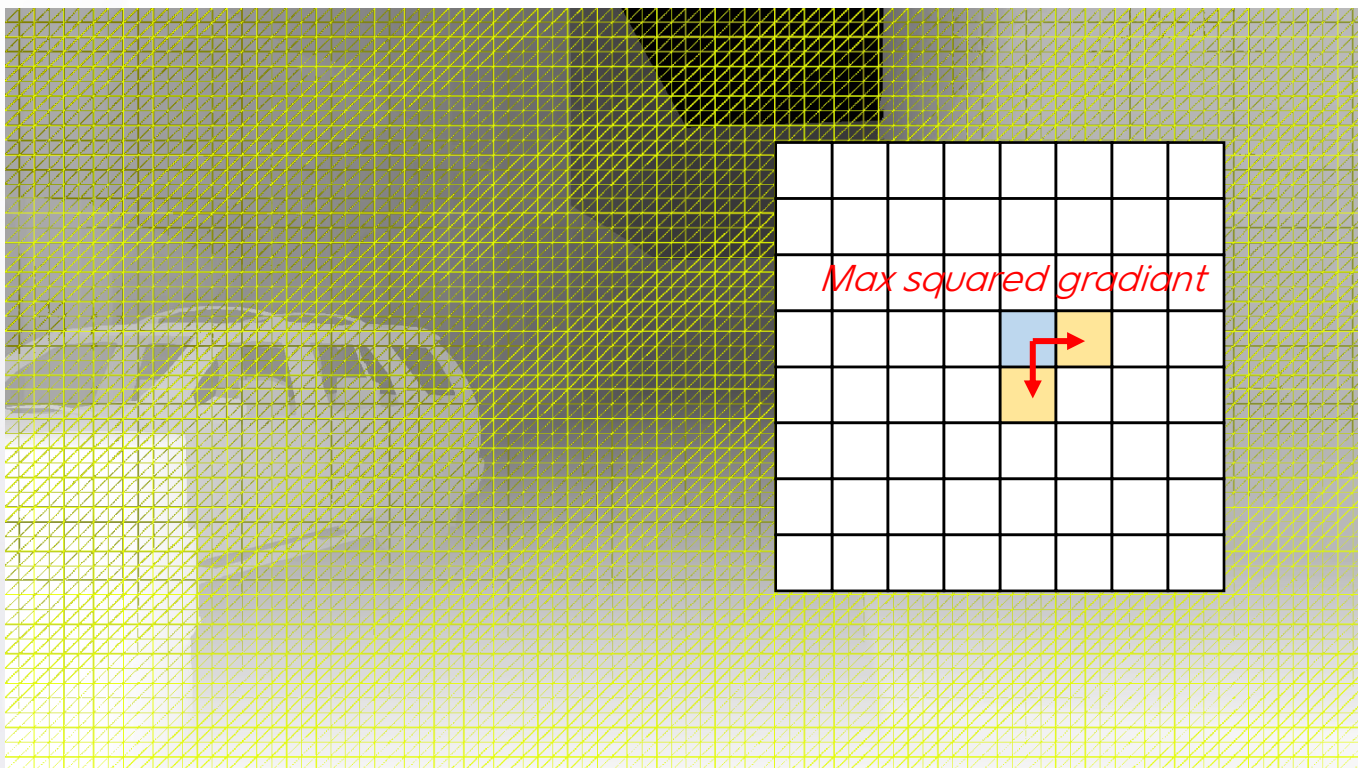
$$(Depth_{x+1,y} - Depth_{x,y})^2 + (Depth_{x,y+1} - Depth_{x,y})^2$$





## Solution: per-vertex reprojection

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
    - Every  $n \times n$  pixels as a tile (with  $n$  between 8 and 16)
    - Search for the pixel with the maximum sum of squared gradients within tiles, which is considered the most likely location of the vertex.



Initial vertices state (upper left of Tile)

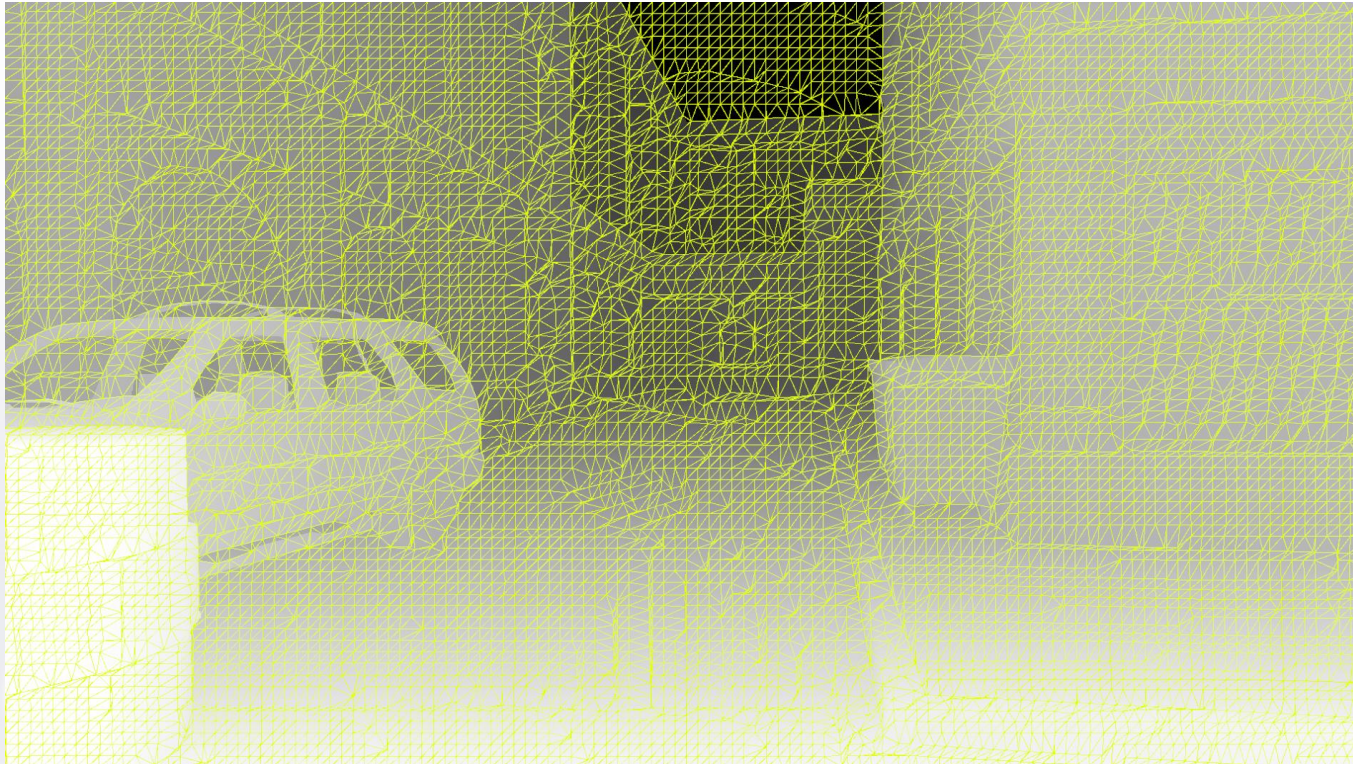
```
void FramePredictionCS()
{
    // Find pixel with max gradient in tile
    float maxSqSum;
    uint2 maxGradientPixelPos;
    foreach (pixel in Tile)
    {
        if (SqSum(pixel.gradient) > maxSqSum)
        {
            maxGradientPixelPos = pixel.pos;
        }
    }

    // ...
}
```

Pseudo-code for searching vertices

## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
    - Every  $n \times n$  pixels as a tile (with  $n$  between 8 and 16)
    - Search for the pixel with the maximum sum of squared gradients within tiles, which is considered the most likely location of the vertex.



***Move vertices to position with max depth gradient in tile***

```
void FramePredictionCS()
{
    // Find pixel with max gradient in tile
    float maxSqSum;
    uint2 maxGradientPixelPos;
    foreach (pixel in Tile)
    {
        if (SqSum(pixel.gradient) > maxSqSum)
        {
            maxGradientPixelPos = pixel.pos;
        }
    }

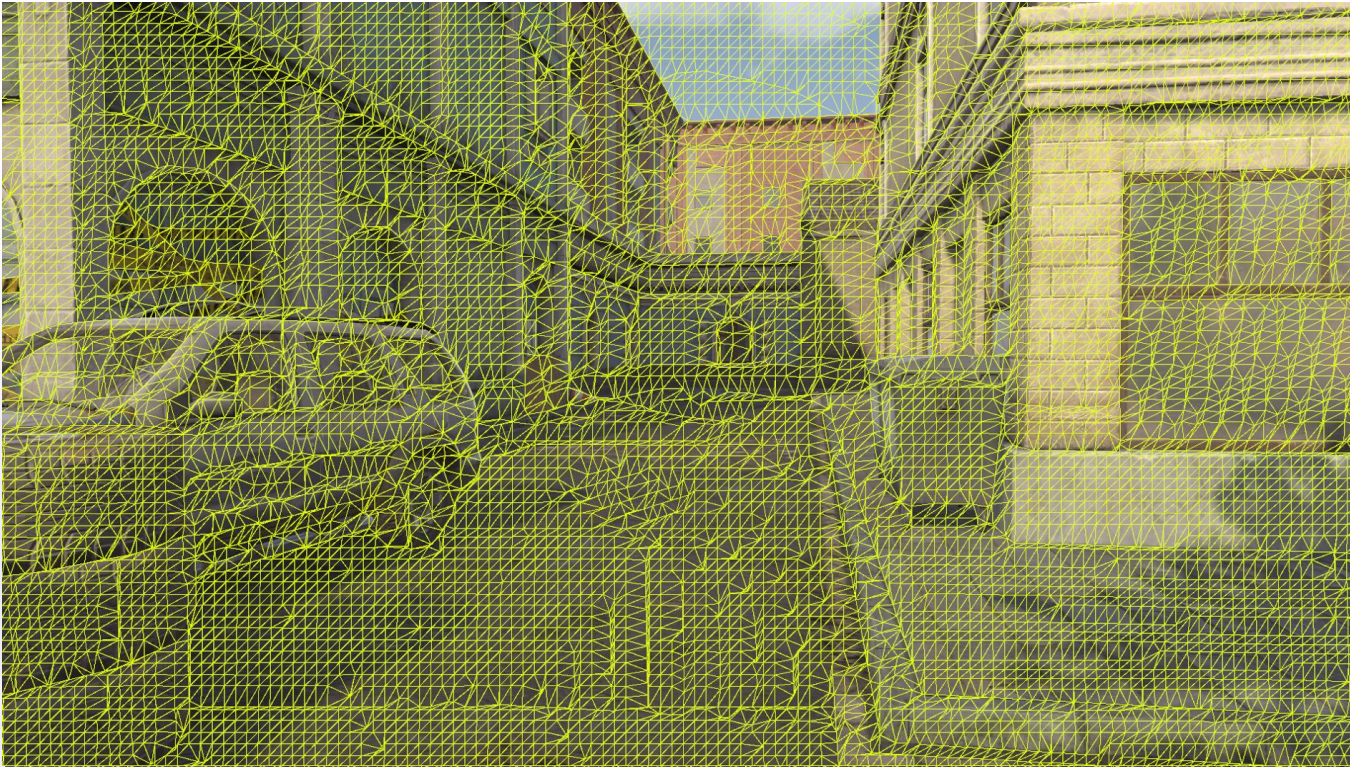
    // ...
}
```

***Pseudo-code for searching vertices***



## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
    - Every  $n \times n$  pixels as a tile (with  $n$  between 8 and 16)
    - Search for the pixel with the maximum sum of squared gradients within tiles, which is considered the most likely location of the vertex.



***View vertices in SceneColor***

```
void FramePredictionCS()
{
    // Find pixel with max gradient in tile
    float maxSqSum;
    uint2 maxGradientPixelPos;
    foreach (pixel in Tile)
    {
        if (SqSum(pixel.gradient) > maxSqSum)
        {
            maxGradientPixelPos = pixel.pos;
        }
    }

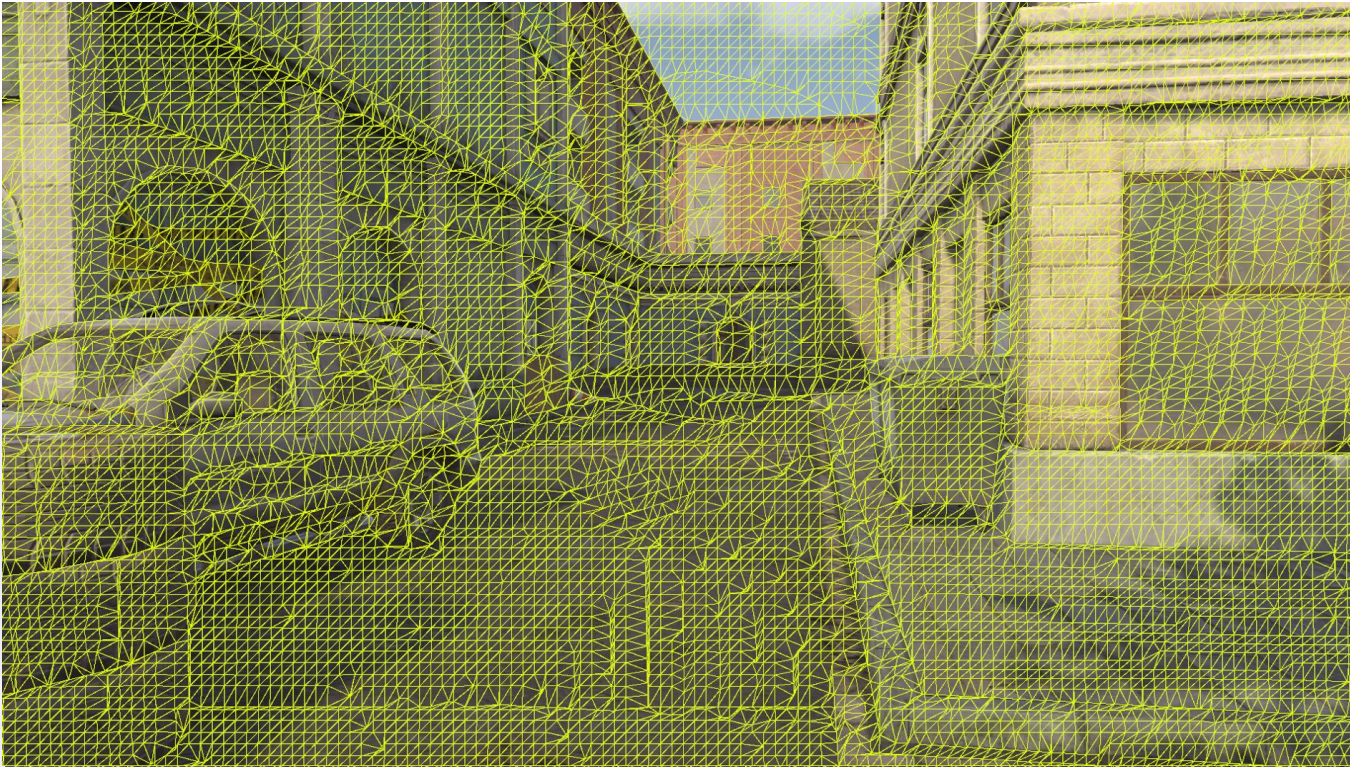
    // ...
}
```

***Pseudo-code for searching vertices***



## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
  - Step 2: Reproject the reconstructed vertices and cache position and UV



***View vertices in SceneColor***

```
void FramePredictionCS()
{
    // Find pixel with max gradient in tile
    {...}

    // Reproject the clip-space position of vertices
    float4 reprojPos = mul(
        float3(maxGradientPixel.ClipPos, 1.0f),
        ReprojectionMatrix
    );
    reprojPos.xyzw /= reprojPos.w;

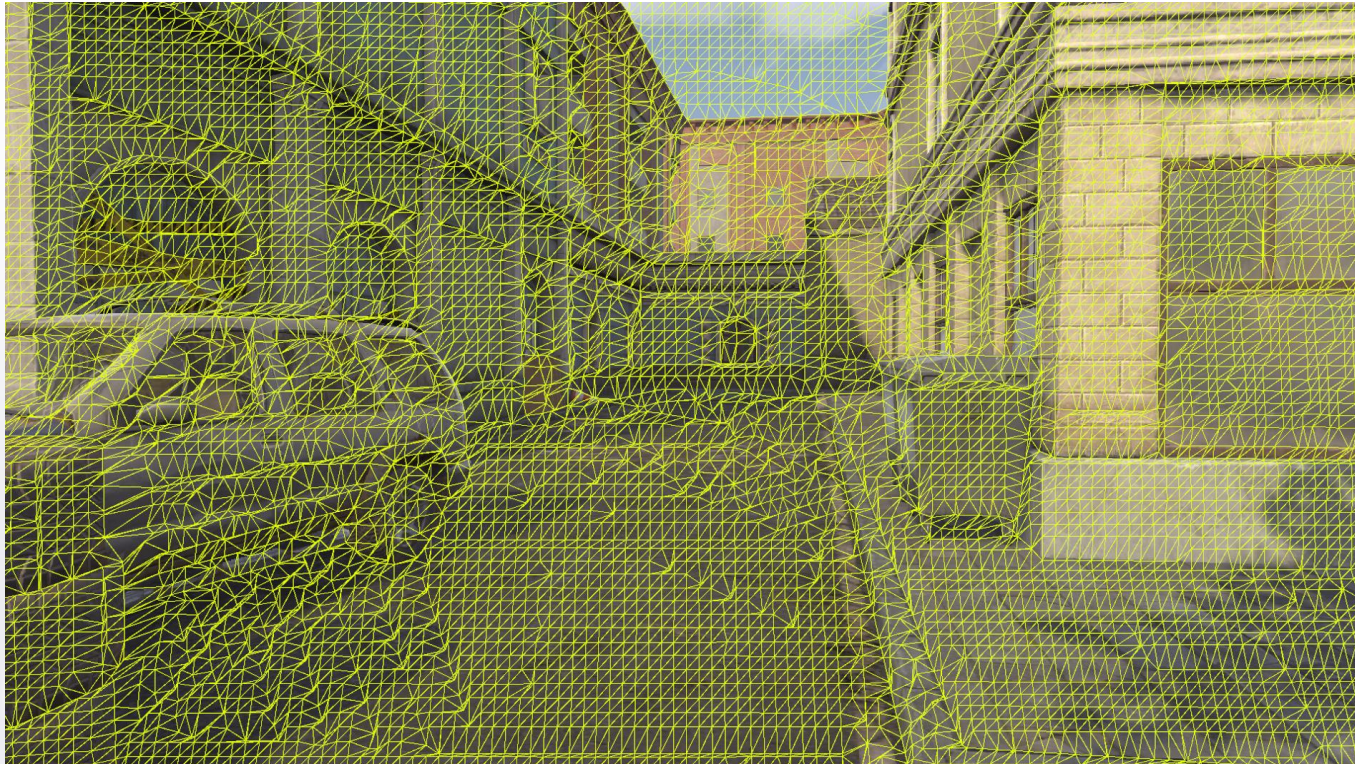
    CacheUAV[vertPos] =
        float4(reprojPos.xy, maxGradientPixel.uv);
}
```

***Pseudo-code for reprojection***



## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
  - Step 2: Reproject the reconstructed vertices and cache position and UV
  - Step 3: Redraw the reconstructed screen space aggregated mesh (SSAM) to generate predicted frame

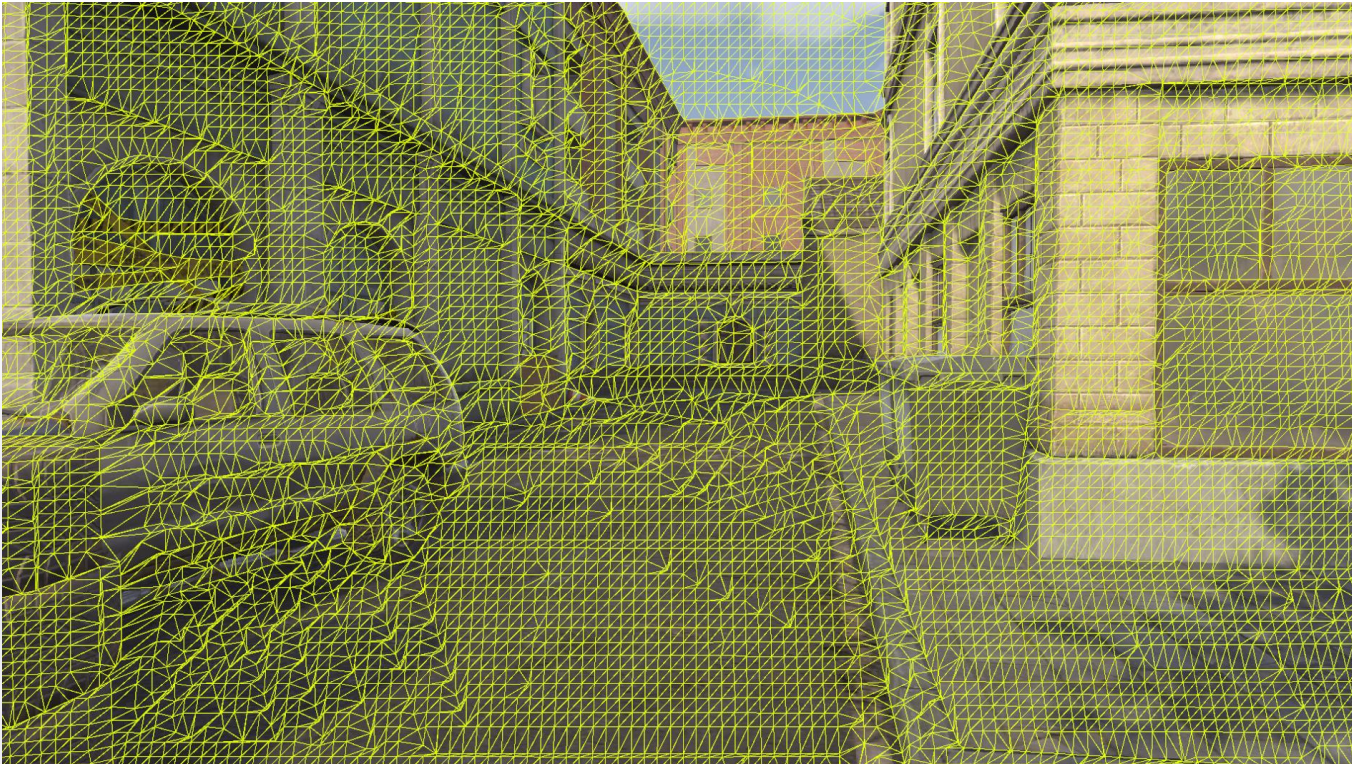


***Redrawn SSAM (camera moves forward)***



## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
  - Step 2: Reproject the reconstructed vertices and cache position and UV
  - Step 3: Redraw the reconstructed screen space aggregated mesh (SSAM) to generate predicted frame



***Redrawn SSAM (camera moves forward)***

```
void FramePredictionVS(uint VertexID)
{
    uint2 VertPos = CalcPos(VertexID);
    OutVertClip = float3(CacheUAV[VertPos].xy, 1);
    OutVertUV = CacheUAV[VertPos].zw;

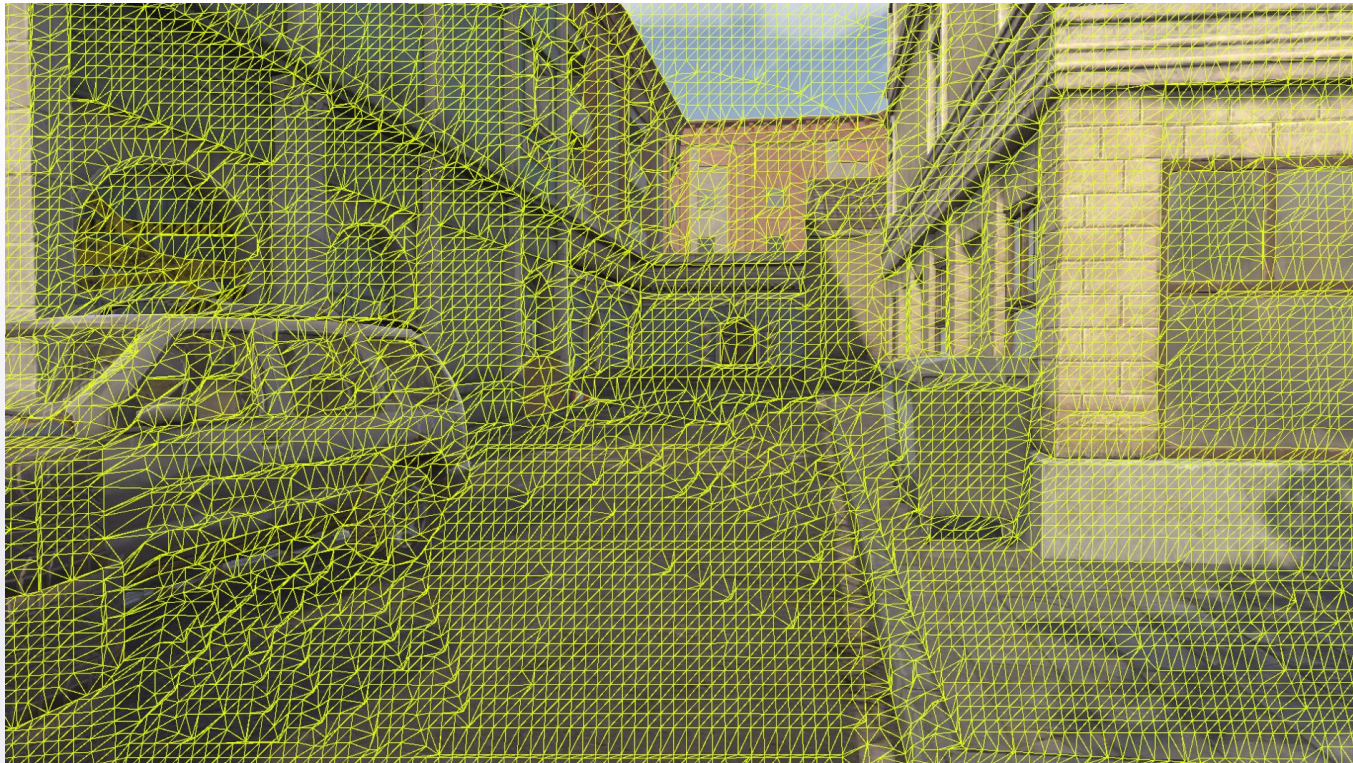
    // Anchored screen edge vertices
    if (VertPos.x == 0 or CacheUAV.Size.x)
    {
        OutVertClip.x = -1 or 1;
        OutVertUV.x = 0 or 1;
    }
    if (VertPos.y == 0 or CacheUAV.Size.y)
    {
        OutVertClip.y = -1 or 1;
        OutVertUV.y = 0 or 1;
    }
}
```

***Pseudo-code of redrawn vertex shader***



## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
  - Step 2: Reproject the reconstructed vertices and cache position and UV
  - Step 3: Redraw the reconstructed screen space aggregated mesh (SSAM) to generate predicted frame



***Redrawn SSAM (camera moves forward)***

```
void FramePredictionPS(float3 InSvPos, float2 InUV)
{
    // Reproject Depth for higher precision
    float prevDepth = CachedDepthTex.Sample(InUV).x;
    float4 projClip = mul(
        ToClipPos(InUV.xy, prevDepth, 1.0f),
        ReprojectionMatrix
    );
    projClip.xyzw /= projClip.w;

    OutDepth = ToDepth(projClip.z); //current depth
    OutColor = CachedColorTex.Sample(InUV).xyz;
}
```

***Pseudo-code of redrawn pixel shader***



## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
  - Step 2: Reproject the reconstructed vertices and cache position and UV
  - Step 3: Redraw the reconstructed screen space aggregated mesh (SSAM) to generate predicted frame



***Generated prediction frame***

```
void FramePredictionPS(float3 InSvPos, float2 InUV)
{
    // Reproject Depth for higher precision
    float prevDepth = CachedDepthTex.Sample(InUV).x;
    float4 projClip = mul(
        ToClipPos(InUV.xy, prevDepth, 1.0f),
        ReprojectionMatrix
    );
    projClip.xyzw /= projClip.w;

    OutDepth = ToDepth(projClip.z); //current depth
    OutColor = CachedColorTex.Sample(InUV).xyz;
}
```

***Pseudo-code of redrawn pixel shader***



## ***Solution: per-vertex reprojection***

- Key idea: reconstruct the mesh in screen space and reproject to generate the predicted frame
  - Step 1: Find the pixels on the SceneDepth where a vertex is most likely to exist
  - Step 2: Reproject the reconstructed vertices and cache position and UV
  - Step 3: Redraw the reconstructed screen space aggregated mesh (SSAM) to generate predicted frame



***Compare with cached SceneColor***

```
void FramePredictionPS(float3 InSvPos, float2 InUV)
{
    // Reproject Depth for higher precision
    float prevDepth = CachedDepthTex.Sample(InUV).x;
    float4 projClip = mul(
        ToClipPos(InUV.xy, prevDepth, 1.0f),
        ReprojectionMatrix
    );
    projClip.xyzw /= projClip.w;

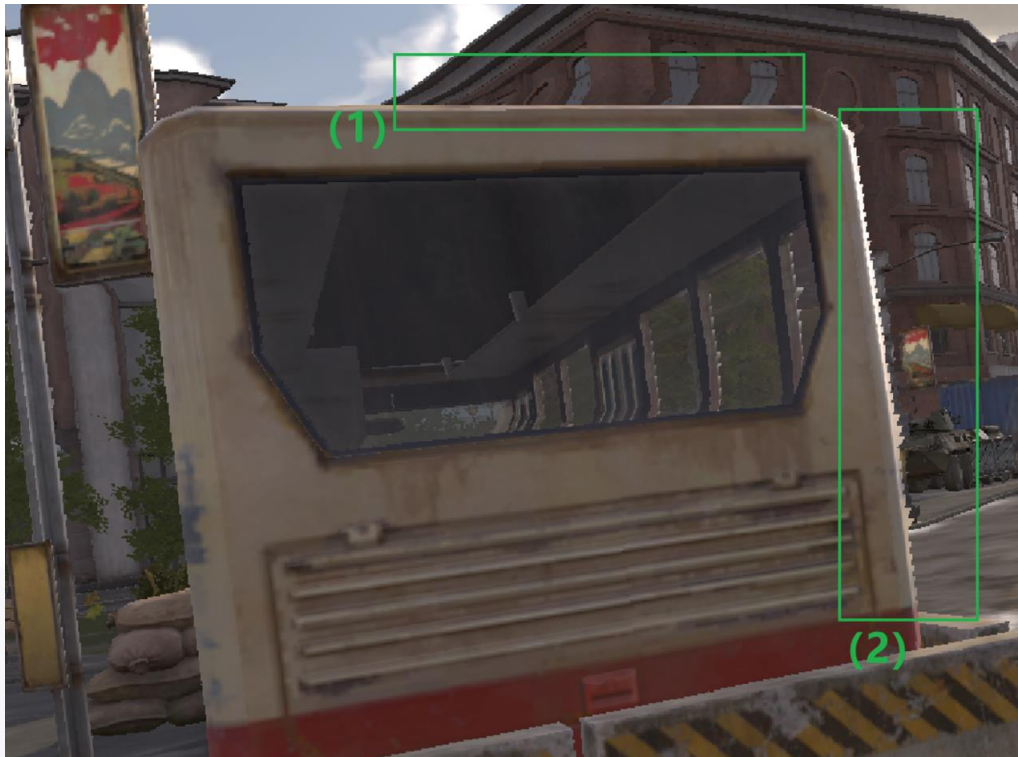
    OutDepth = ToDepth(projClip.z); //current depth
    OutColor = CachedColorTex.Sample(InUV).xyz;
}
```

***Pseudo-code of redrawn pixel shader***

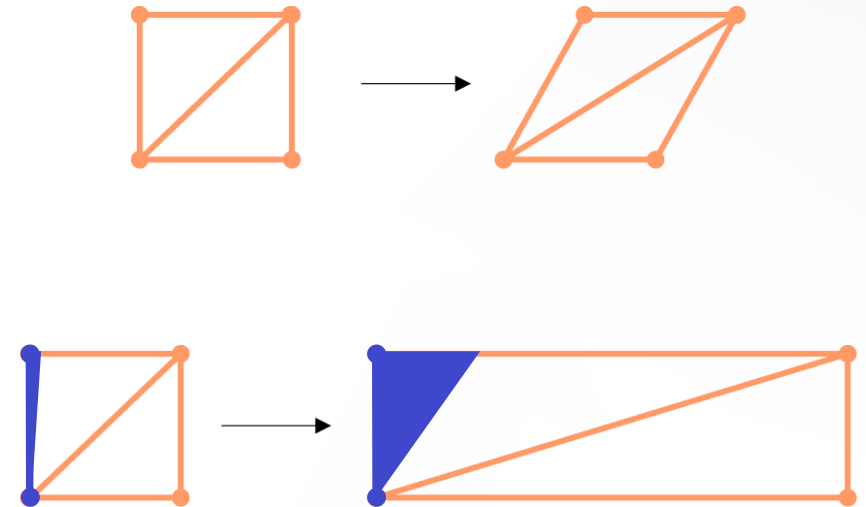
## Correction of distortion

Naïve redrawn SSAM could cause:

- Shear distortion: The windows in the background are bent
- Tensile distortion: Bleeding color from the foreground into the background



Shear (1) and tensile (2) distortion

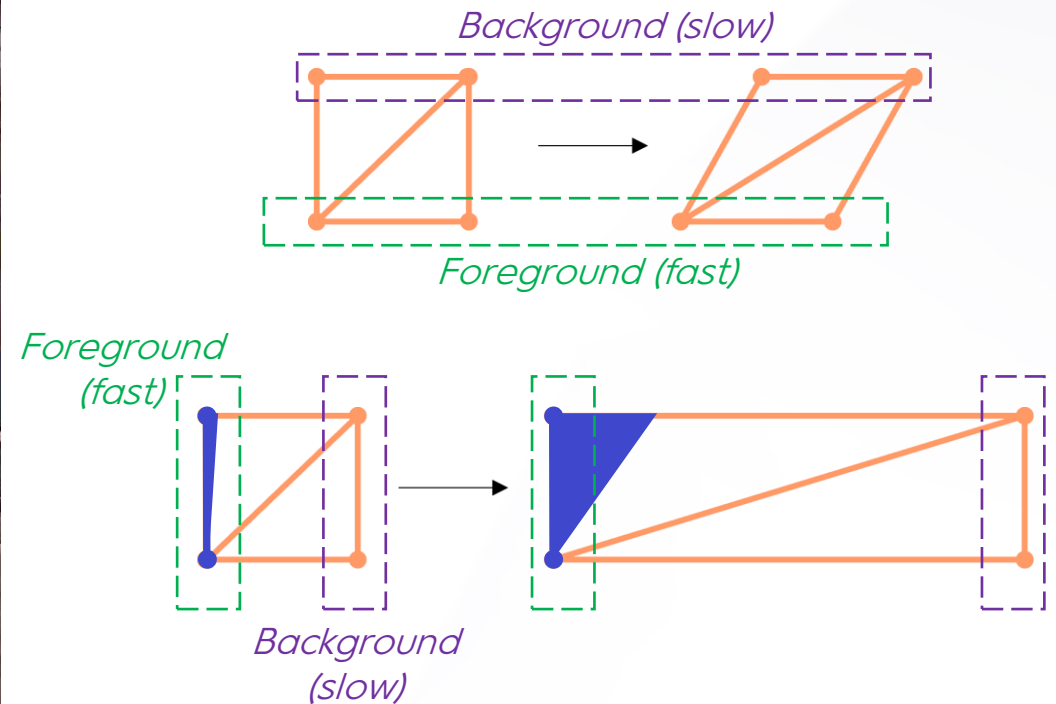


Schematic of distortion

## Correction of distortion

Naïve redrawn SSAM could cause:

- Shear distortion: The windows in the background are bent
- Tensile distortion: Bleeding color from the foreground into the background



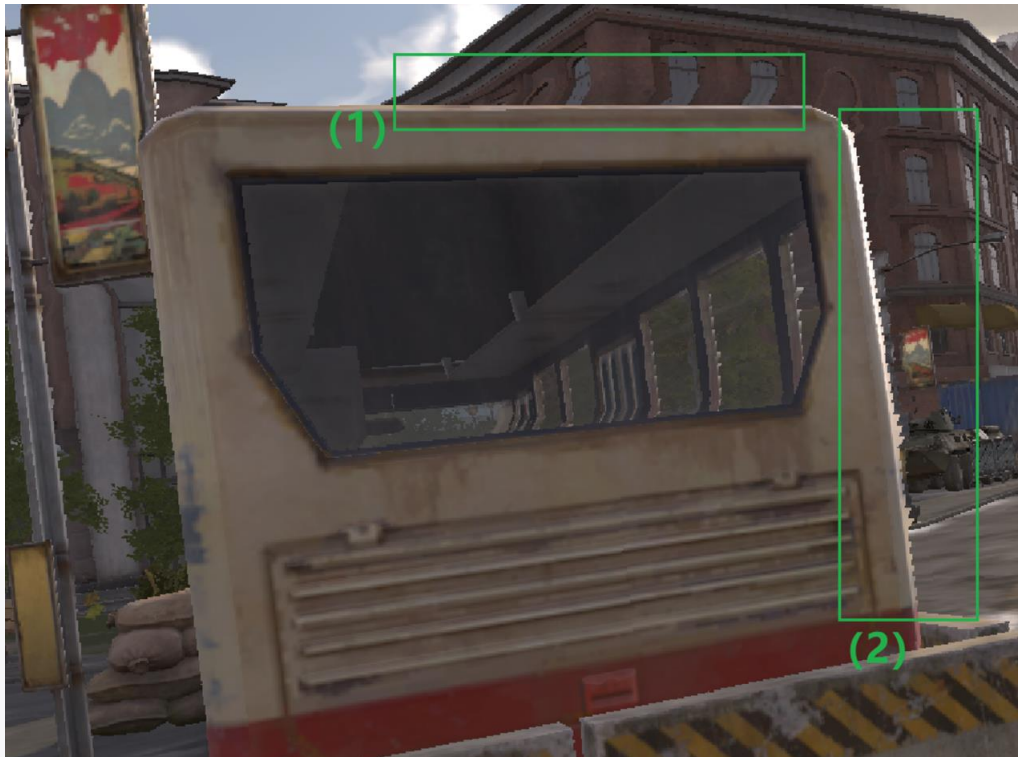
Schematic of distortion



## Correction of distortion

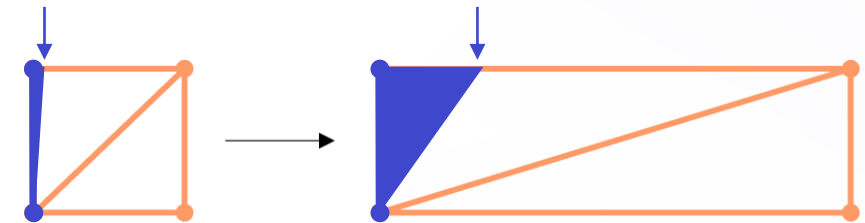
Correction of tensile distortion: Compare the relative displacements of neighboring pixels

- If the relative displacement is very small: in the same depth semantic layer
- If the relative displacement is large: in different depth semantic layers, needs correction



*Shear (1) and tensile (2) distortion*

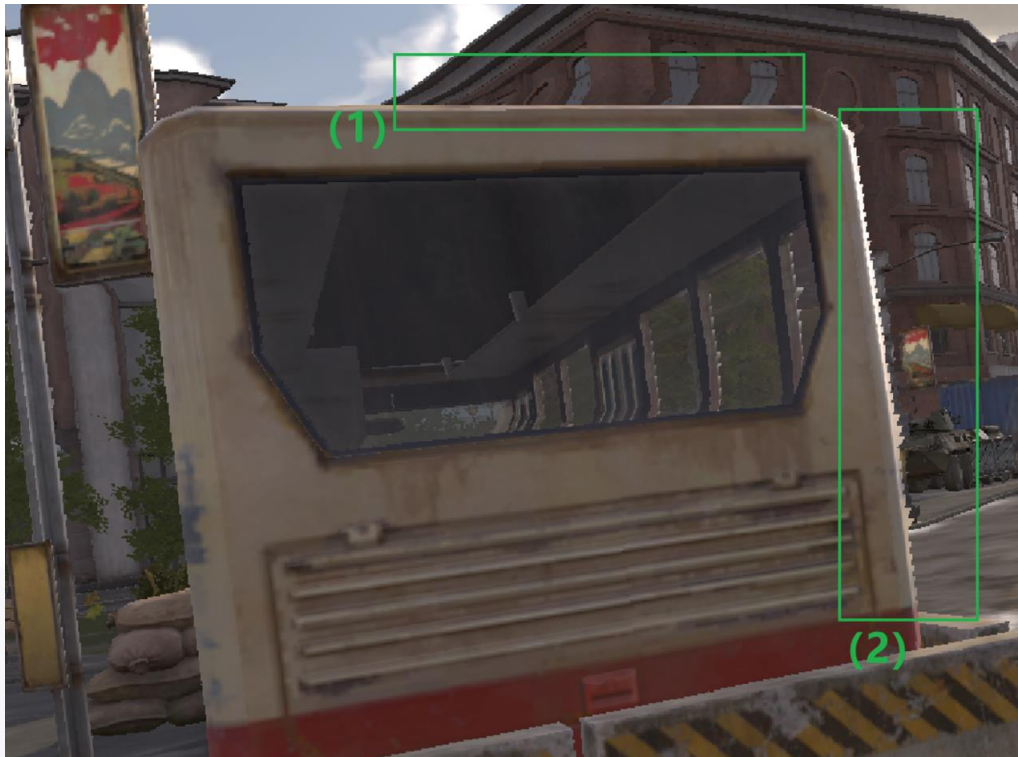
*Foreground UV boundaries*



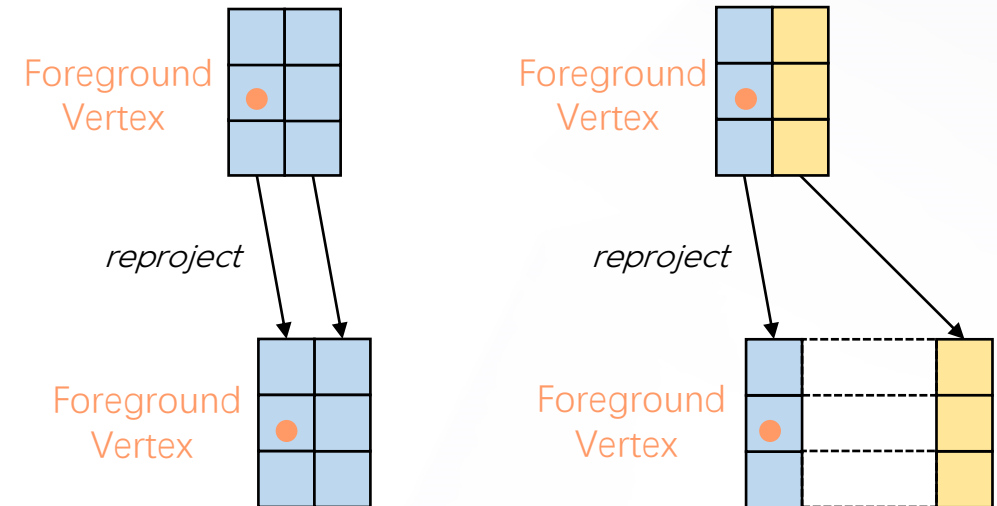
## Correction of distortion

Correction of tensile distortion: Compare the relative displacements of neighboring pixels

- If the relative displacement is very small: in the same depth semantic layer
- If the relative displacement is large: in different depth semantic layers, needs correction



*Shear (1) and tensile (2) distortion*



*Small and large relative displacements*

## Correction of distortion

Correction of tensile distortion: Compare the relative displacements of neighboring pixels

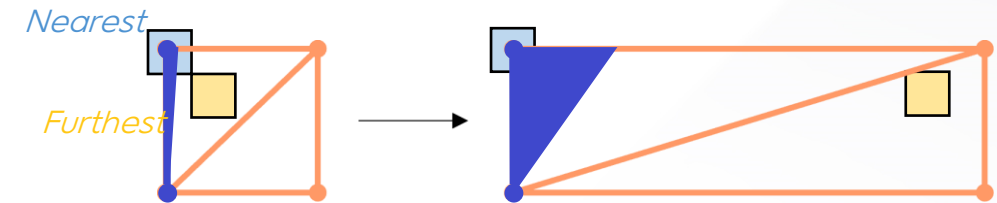
- If the relative displacement is very small: in the same depth semantic layer
- If the relative displacement is large: in different depth semantic layers, needs correction
  - Solution using a tiny UV-bias: apply the foreground pixel's clip-space position with the background pixel's UV

```
void FramePredictionCS()
{
    // Find pixel with max gradient in tile
    {...}

    // Find foreground pixel and background pixel
    PixelInfo foregroundPixel, backgroundPixel;
    foreach (neighbors of maxGradientPixel)
    {
        if (CloserThan(neighbor.depth, foregroundPixel.depth))
        {
            foregroundPixel.clipPos = neighbor.clipPos;
            foregroundPixel.uv = neighbor.uv;
        }
        if (FurtherThan(neighbor.depth, backgroundPixel.depth))
        {
            backgroundPixel.clipPos = neighbor.clipPos;
            backgroundPixel.uv = neighbor.uv;
        }
    }

    //...
}
```

*Pseudo-code of tensile distortion correction*



*Schematic of tensile distortion correction*

## Correction of distortion

Correction of tensile distortion: Compare the relative displacements of neighboring pixels

- If the relative displacement is very small: in the same depth semantic layer
- If the relative displacement is large: in different depth semantic layers, needs correction
  - Solution using a tiny UV-bias: apply the foreground pixel's clip-space position with the background pixel's UV

```
void FramePredictionCS()
{
    // Find pixel with max gradient in tile
    // Find foreground pixel and background pixel
    {...}

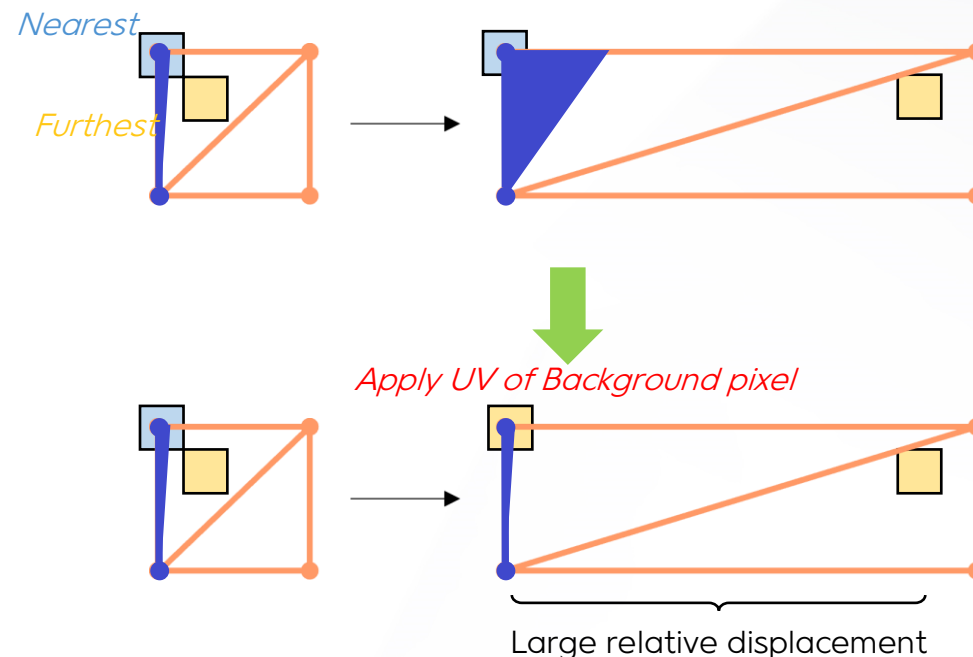
    // Reprojection of foreground pixel and background pixel
    float4 foregroundReprojPos = mul(
        float3(foregroundPixel.clipPos, 1.0f),
        ReprojectionMatrix);
    foregroundReprojPos.xyzw /= foregroundReprojPos.w;

    float4 backgroundReprojPos = mul(
        float3(backgroundPixel.clipPos, 1.0f),
        ReprojectionMatrix);
    backgroundReprojPos.xyzw /= backgroundReprojPos.w;

    if (SameRelativeDir(foregroundPixel.clipPos - backgroundPixel.clipPos,
        foregroundReprojPos.xy - backgroundReprojPos.xy) &&
        abs(foregroundReprojPos.xy - backgroundReprojPos.xy) > Threshold)
    {
        foregroundPixel.uv = backgroundPixel.uv; //tiny UV-bias
    }

    CacheUAV[vertPos] = float4(foregroundReprojPos.xy, foregroundPixel.uv);
}
```

Pseudo-code of tensile distortion correction



Schematic of tensile distortion correction

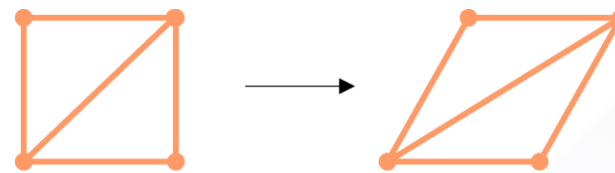
## Correction of distortion

Correction of shear distortion: inverse reprojection and compare UV during redrawing

```
void FramePredictionPS(float3 InSvPos, float2 InUV)
{
    // Reproject Depth for higher precision
    float prevDepth = CachedDepthTex.Sample(InUV).x;
    float4 projClip = mul(
        ToClipPos(InUV.xy, prevDepth, 1.0f),
        ReprojectionMatrix
    );
    projClip.xyzw /= projClip.w;
    OutDepth = ToDepth(projClip.z); //current depth
    OutColor = CachedColorTex.Sample(InUV).xyz;
}
```

*Got depth in PS*

Pseudo-code of shear distortion correction



Schematic of shear distortion correction

$$\begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_{k-1} = P_{k-1} V_{k-1} \underbrace{M_{k-1} M_k^{-1}}_{=I} V_k^{-1} P_k^{-1} \begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_k$$

*Got!*

Reprojection from frame  $k$  to frame  $k-1$  in pixel shader



## Correction of distortion

Correction of shear distortion: inverse reprojection and compare UV during redrawing

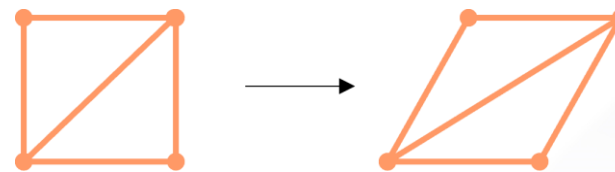
```
void FramePredictionPS(float3 InSvPos, float2 InUV)
{
    // Reproject Depth for higher precision
    {...}
    OutDepth = ToDepth(projClip.z); //current depth

    // Inverse reprojection correction
    float2 ScreenUV = ClipToUv(InSvPos.xy);
    float4 InvReprojClipPos = mul(
        ToClipPos(ScreenUV, OutDepth, 1.0f),
        InverseReprojectionMatrix);
    foregroundReprojPos.xzyw /= foregroundReprojPos.w;

    float2 prevUV = ClipToUv(InvReprojClipPos.xy);
    float DepthBeforeReproj = CachedDepthTex.Sample(prevUV).x;

    if (ApproxEqual(prevDepth, DepthBeforeReproj) &&
        abs(InUV - prevUV) > ThresholdValue)
    {
        OutColor = CachedColorTex.Sample(prevUV).xyz;
    }
    else
    {
        OutColor = CachedColorTex.Sample(InUV).xyz;
    }
}
```

Pseudo-code of shear distortion correction



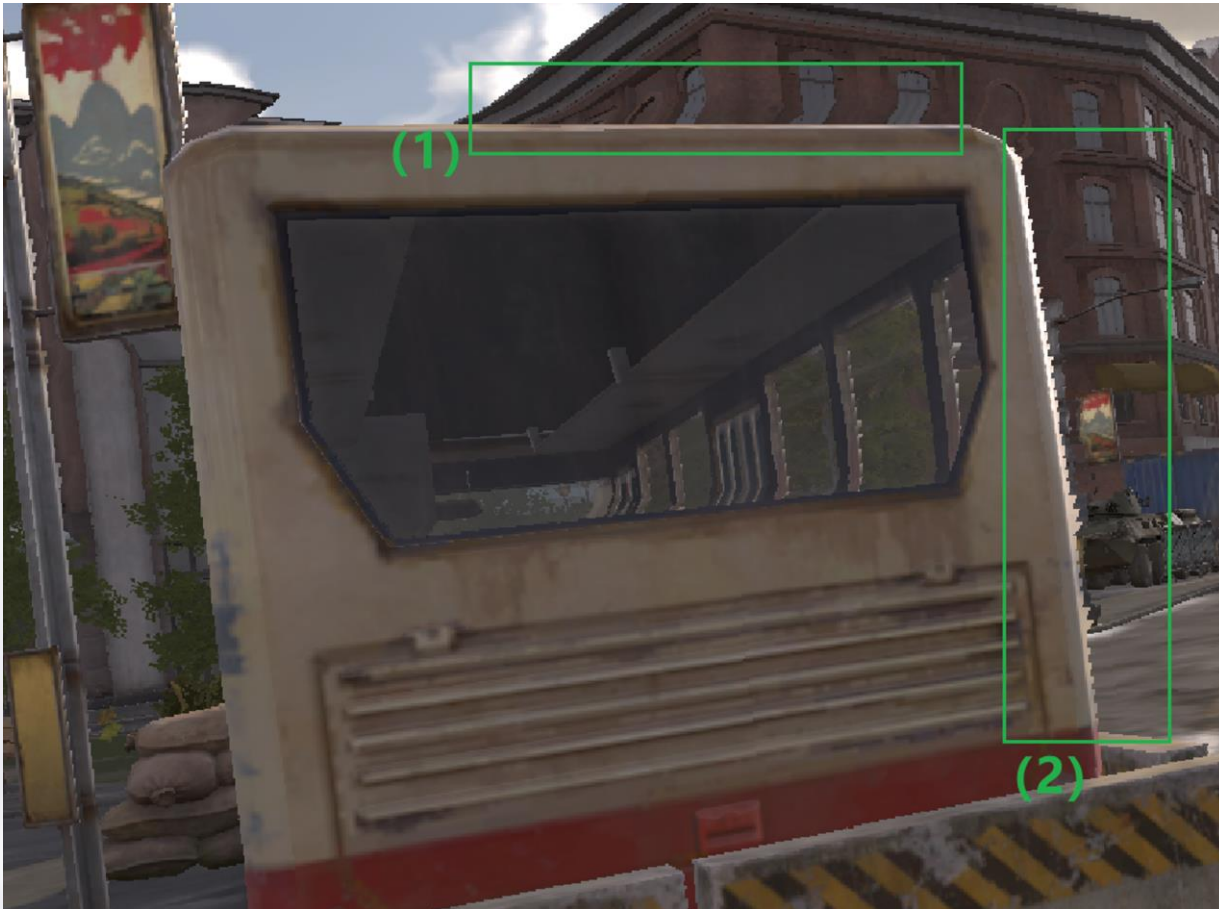
Schematic of shear distortion correction

$$\begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_{k-1} = P_{k-1} V_{k-1} \underbrace{M_{k-1} M_k^{-1}}_{=I} V_k^{-1} P_k^{-1} \begin{bmatrix} x \\ y \\ z \\ w \end{bmatrix}_k \text{ Got!}$$

Reprojection from frame  $k$  to frame  $k-1$  in pixel shader

## Correction of distortion

Comparison:



*Shear (1) and tensile (2) distortion*



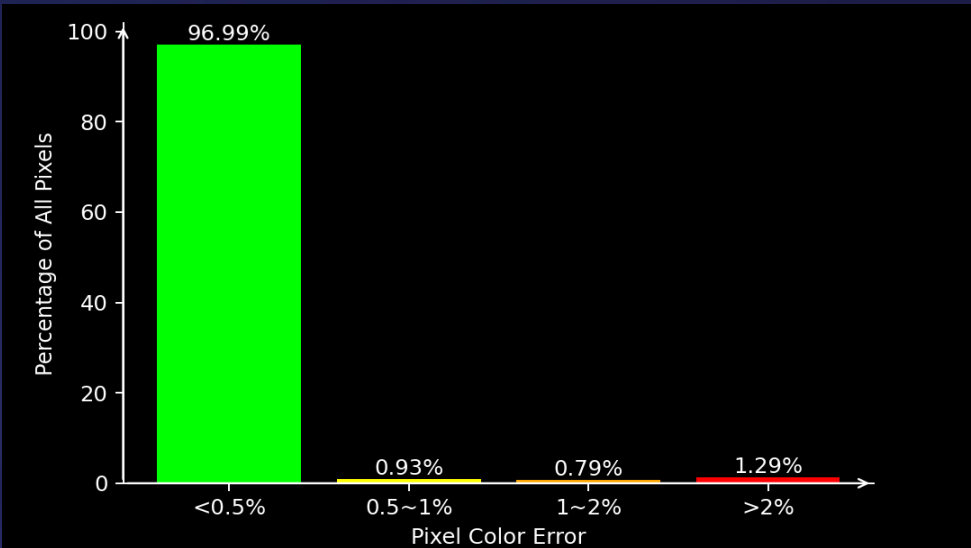
*With corrections*



**Prediction accuracy analysis: Camera moves forward, DeltaTime = 16.67ms**

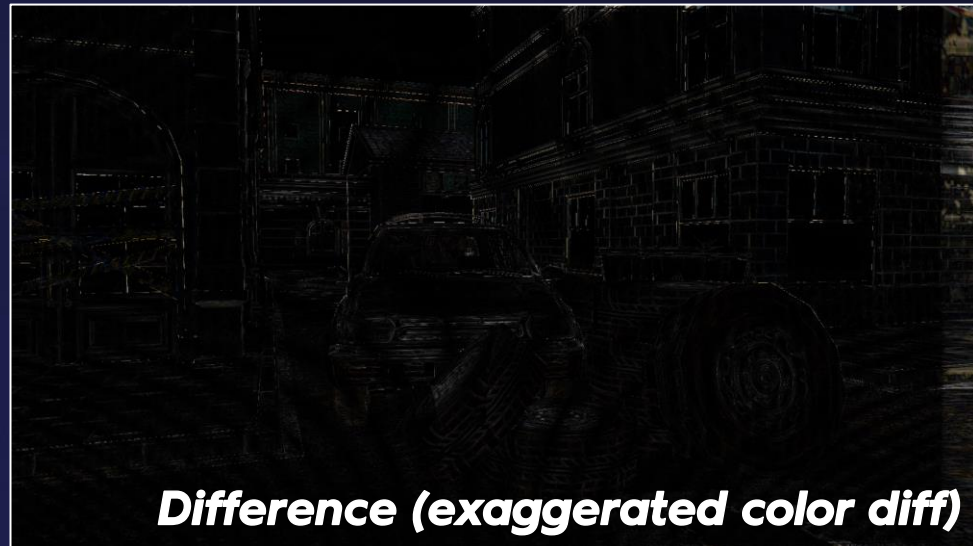


## Prediction accuracy analysis: Camera moves forward, DeltaTime = 16.67ms



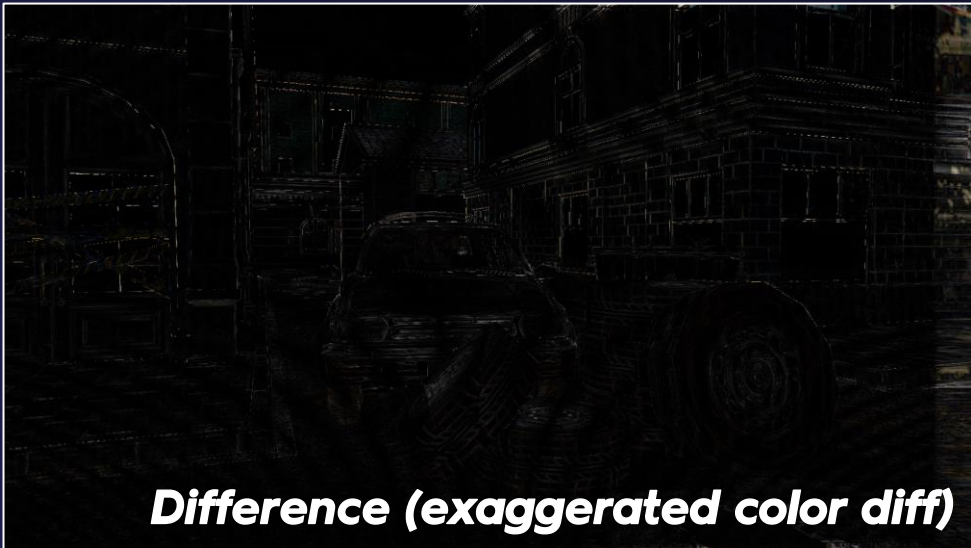
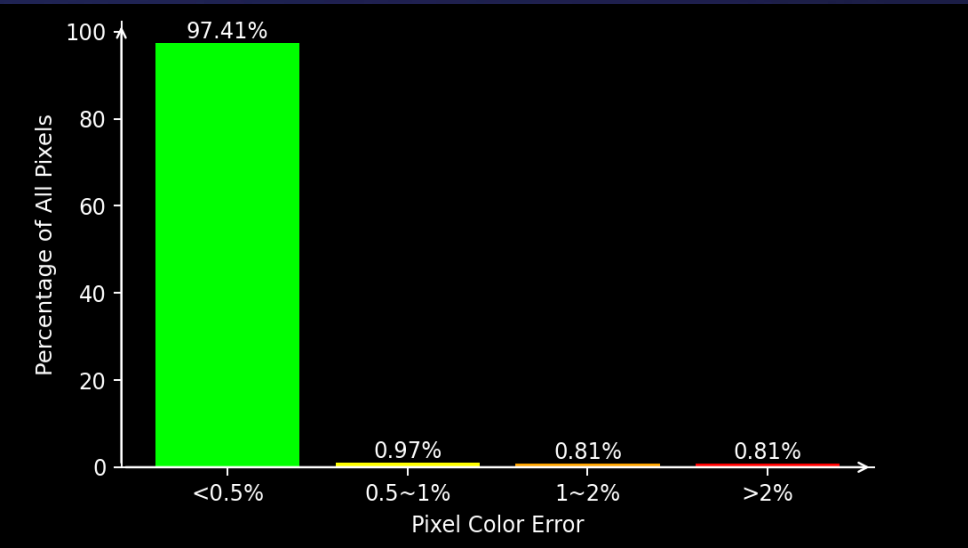


**Prediction accuracy analysis: Camera rotates to right, DeltaTime = 16.67ms**





## Prediction accuracy analysis: Camera rotates to right, DeltaTime = 16.67ms



## ***Correction of missing pixels at the edge of the screen***

If it's necessary to correct the interpolated pixels through rasterization at the screen edge, we can predict the motion of camera, render additional pixels in the previous frame, and clip when used.

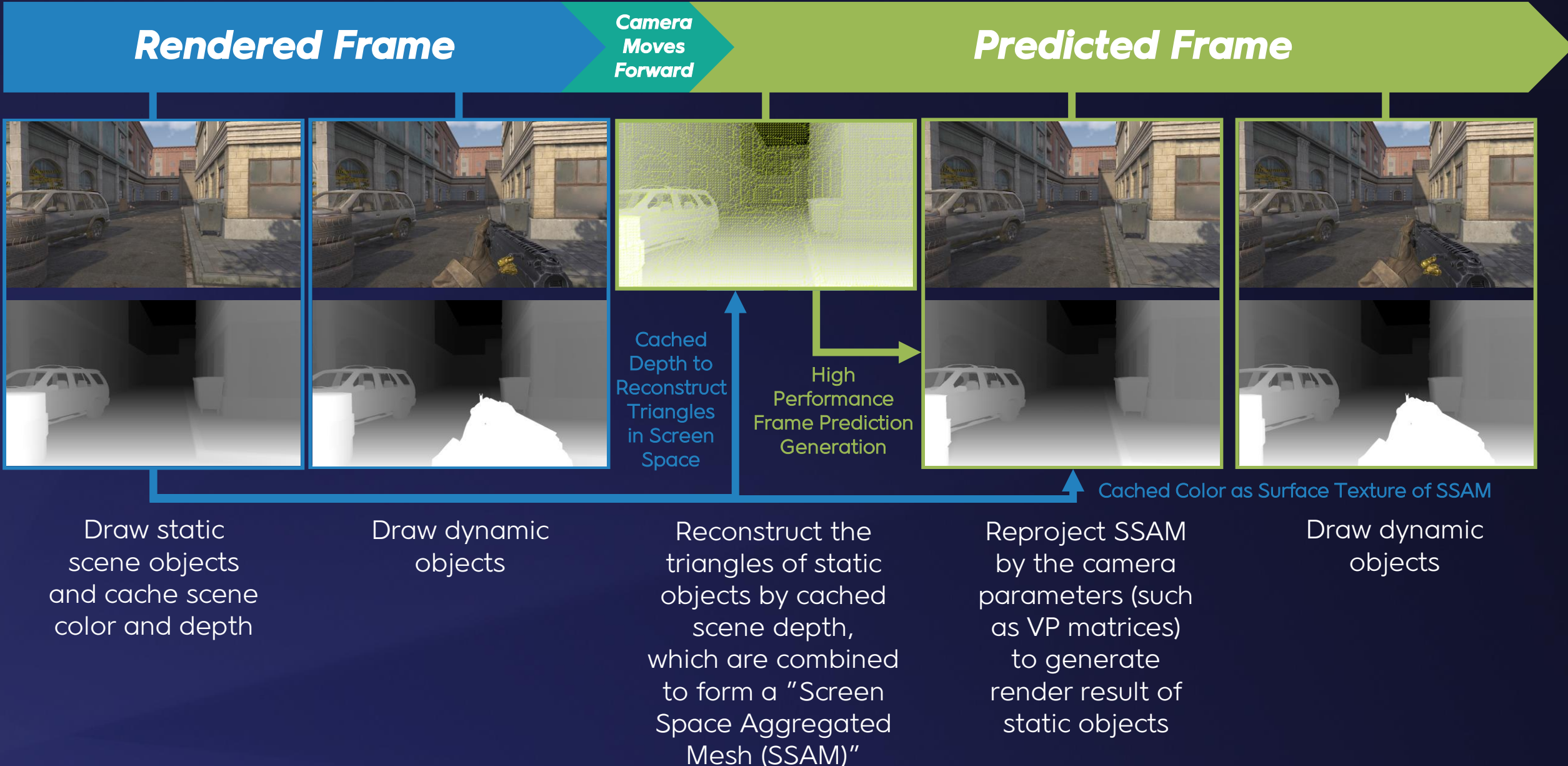


***Rendering additional pixels and clip when used***

# **03** *Rendering Pipelines*

*The corresponding rendering pipelines with frame prediction*

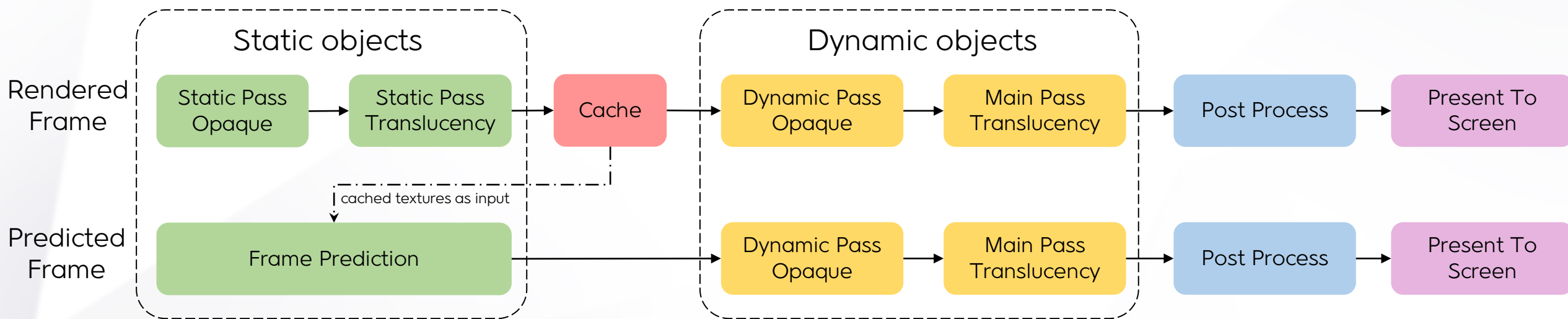




## Pipeline 1: Rendered and predicted frame in different logic frame

This pipeline pairs every two frames into a "rendered frame-predicted frame" set:

- One logic frame corresponds to one graphic frames
- Perfect game control feel in high frame rate
- Reduce the workload of drawing static objects by half



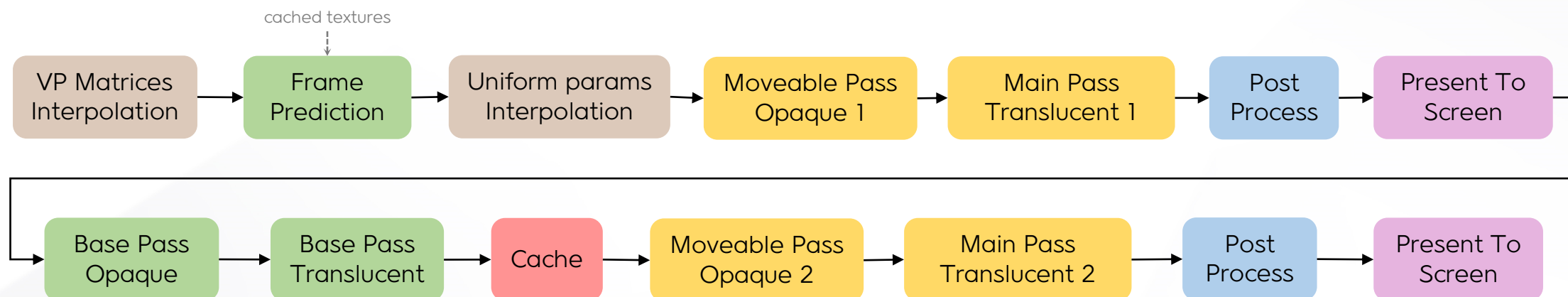
Structure of rendering pipeline 1



## Pipeline 2: Rendered and predicted frame in one logic frame

Make intermediate frame by frame prediction (static) and interpolated uniform parameters (dynamic):

- One logic frame corresponds to two graphic frames
- No negative impact on game control feel (rendered frame can still be presented immediately)
- Very high efficiency

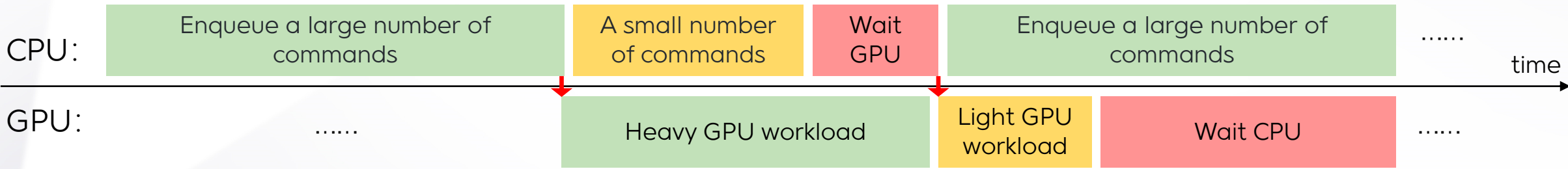


*Structure of pipeline with smoothed intermediate frame*

## Workload balance

The imbalanced frame workload could be inefficient with some device driver strategies (e.g. Qualcomm DCVS)

- CPU and GPU wait each other

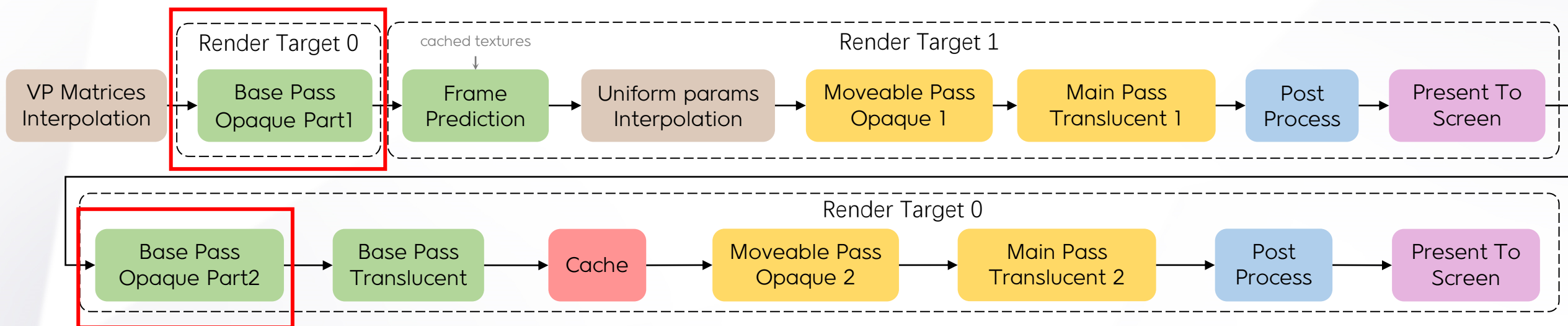


*CPU and GPU wait each other*

## Workload balance

The imbalance frame workload could be inefficient with some device driver strategies (e.g. Qualcomm DCVS)

- CPU and GPU wait each other
- Solution: Split the rendering of base pass and use two render targets — but additional bandwidth
- Looking forward specific GPU/API optimizations for inhomogeneous workloads



**Workload balance for pipeline with smoothed intermediate frame**

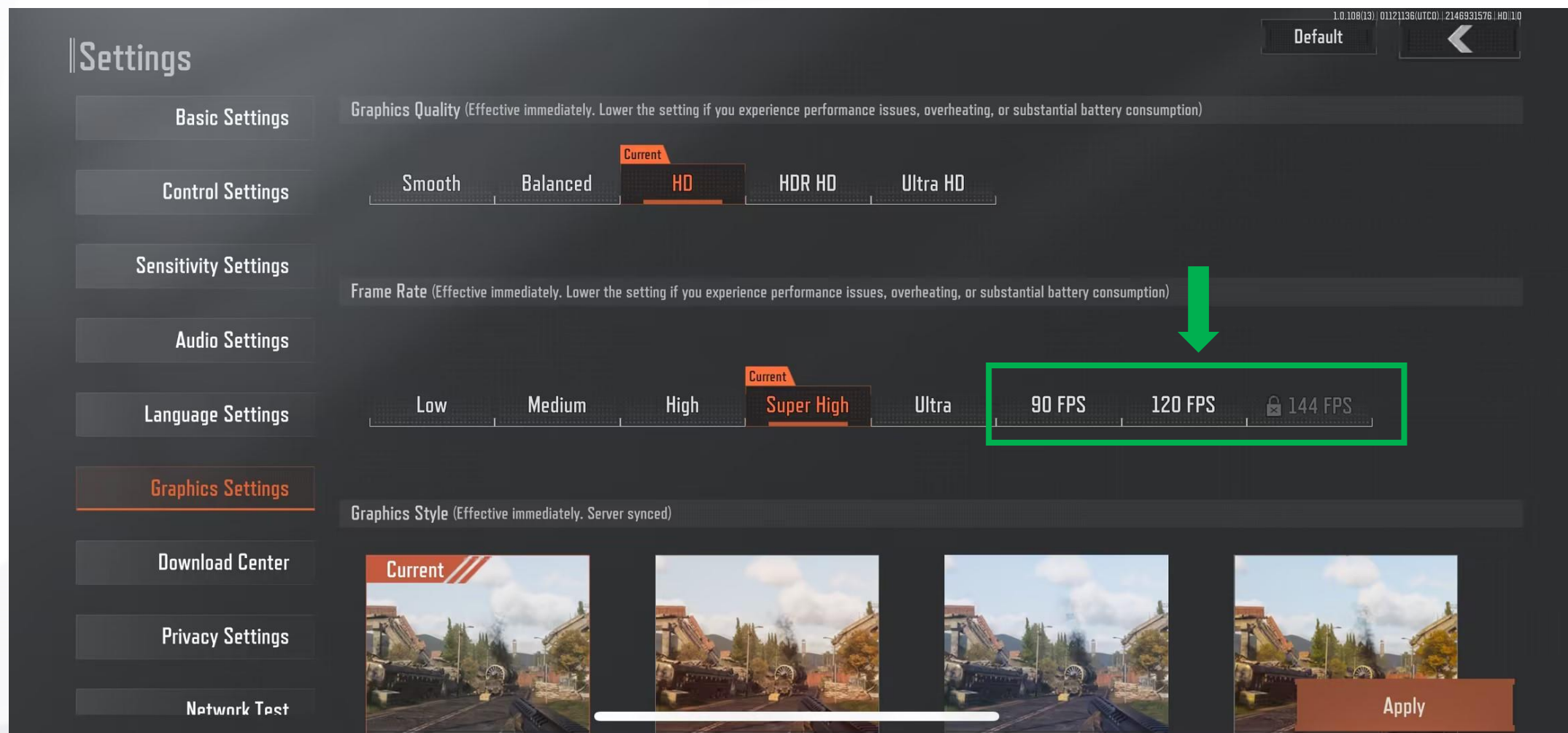


# **04 Conclusion**

*Analysis of performance and further applications*

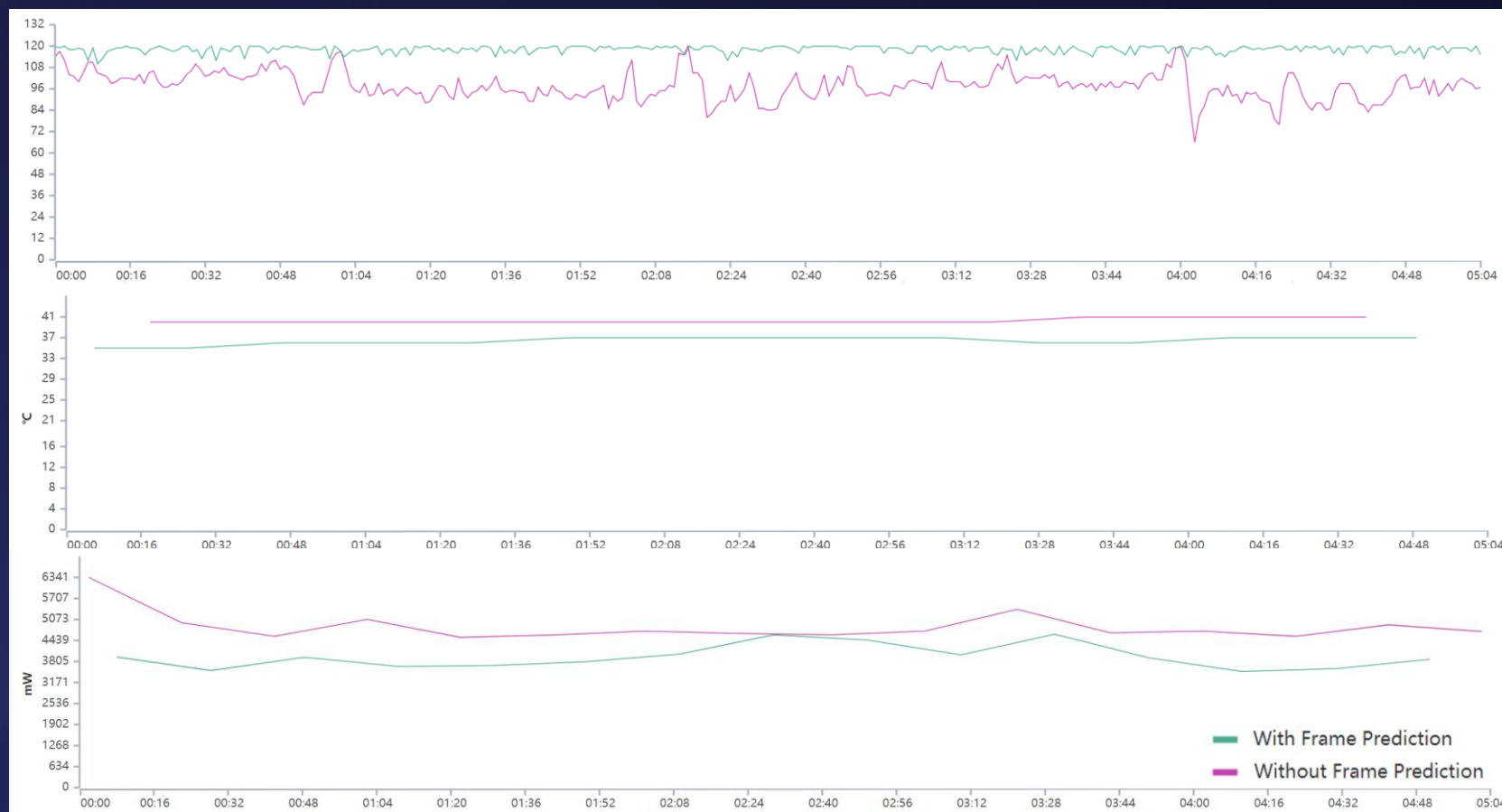
## Frame Prediction is successfully applied in the released game!

Select 90, 120 and 144 FPS in setting of *Arena Breakout* to activate rendering pipelines with frame prediction!



## Performance data comparison

With the frame prediction on iPhone 14 Pro, the average frame rate has increased from 97.7 to 118.3 FPS, the surface temperature has been reduced from 40.3°C (104.5°F) to 36.4°C (97.5°F), and the battery power consumption has been reduced by 19%.





## Performance data comparison

With the frame prediction on Android smartphone equipped with Qualcomm Snapdragon 7+ Gen 2, the average frame rate of 720P can reach up to the impressive 140.2FPS.



## ***Reuse ray's info in mobile ray tracing***

Frame prediction can also be used in mobile ray tracing to reuse the ray-infos in screen space.



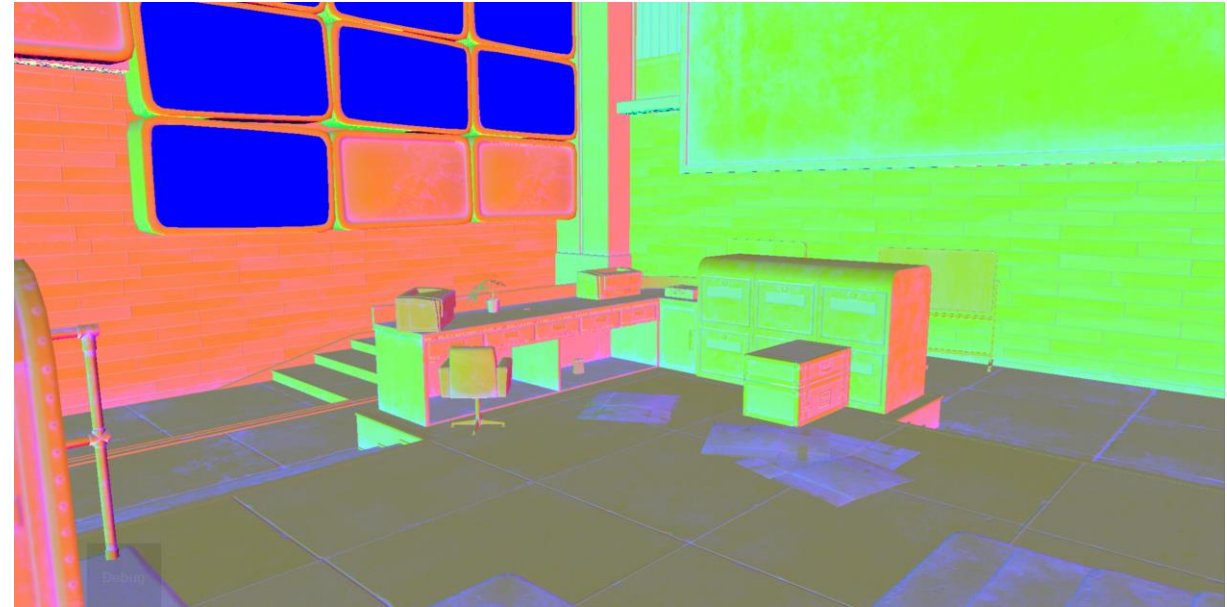
***Mobile ray tracing OFF***



***Mobile ray tracing ON***

## ***Reuse ray's info in mobile ray tracing***

Frame prediction can also be used in mobile ray tracing to reuse the ray-infos in screen space.



***Reusable features in screen space***



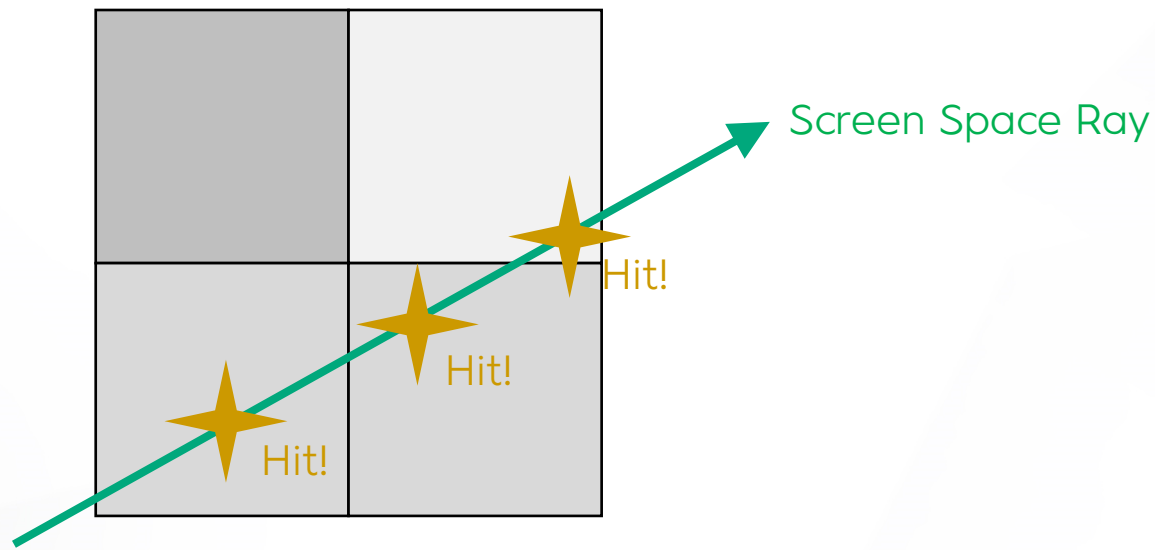
## Performance data comparison

With the frame prediction on Android smartphone equipped with Mediatek Dimensity 9300, the average frame rate for mobile ray-tracing reflection has increased from 62.5 to 89.2 FPS, and frame prediction avoids also the overheating protection of chip and the frame rate limitation from OS.



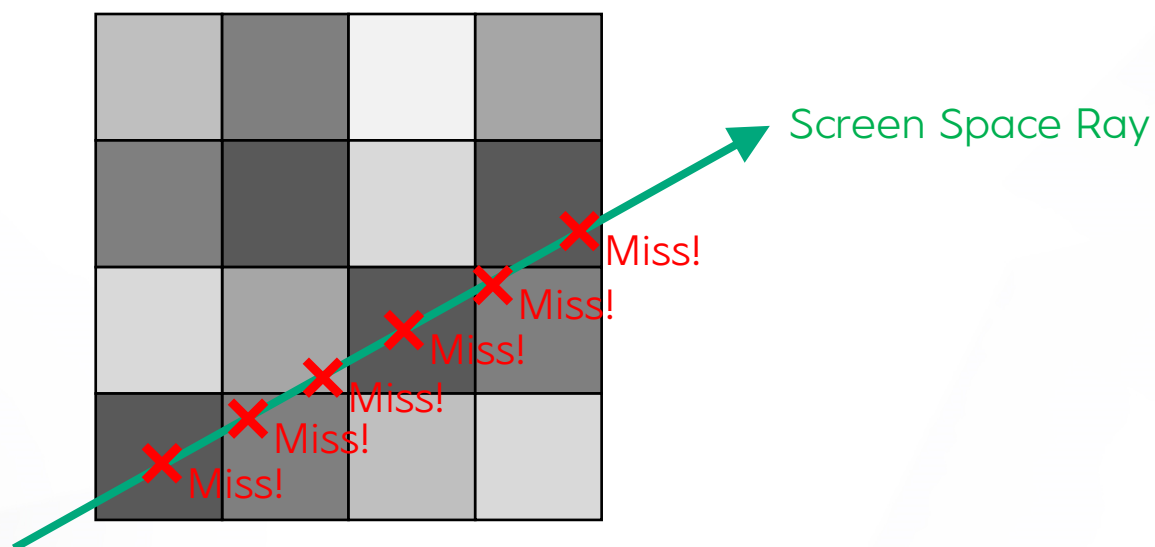
## Accelerate the screen space global illumination

- Mipmap acceleration: has "Canyon-Effect" (rays hit in higher-level mipmap but missed in lower-level mipmap, because mipmap uses the nearest depth pooling) – can cause a lot of additional sampling



## Accelerate the screen space global illumination

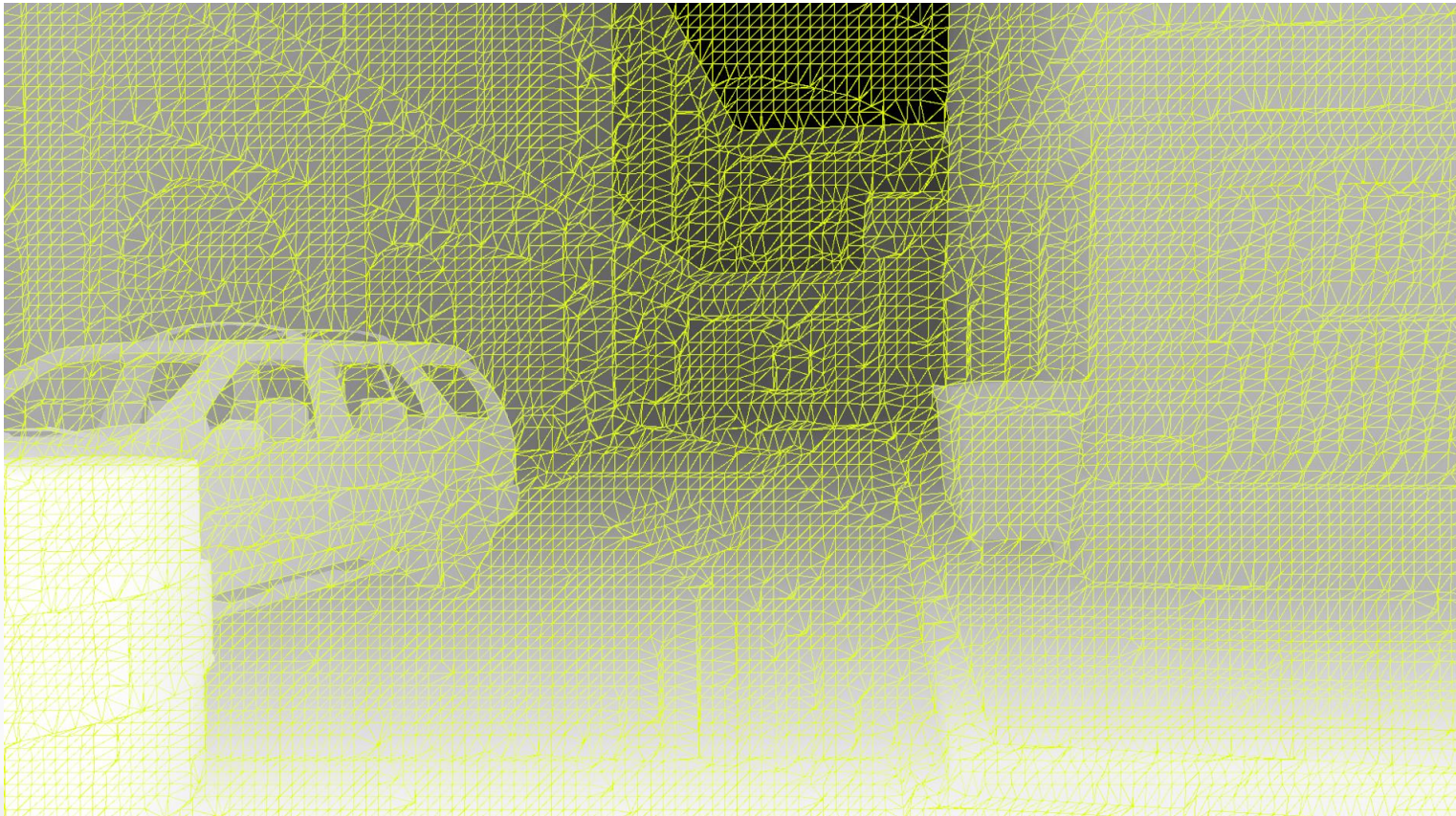
- Mipmap acceleration: has "Canyon-Effect" (rays hit in higher-level mipmap but missed in lower-level mipmap, because mipmap uses the nearest depth pooling) – can cause a lot of additional sampling





## ***Accelerate the screen space global illumination***

- Mipmap acceleration: has “Canyon-Effect” (rays hit in higher-level mipmap but missed in lower-level mipmap, because mipmap uses the nearest depth pooling) – can cause a lot of additional sampling
- Screen space aggregated mesh (SSAM) acceleration: ray-pixel intersection → ray-triangle intersection



***Reconstructed triangles of SSAM***

*Thank  
You*



GDC