

Sort-free Gaussian Splatting via Weighted Sum Rendering

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Alexei Bourd², Amir Said^{*1}

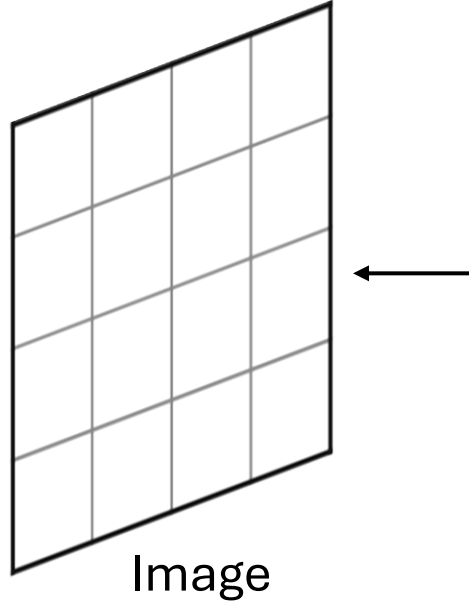
¹ Qualcomm AI Research[†]

² Graphic Research Team

* Corresponding author

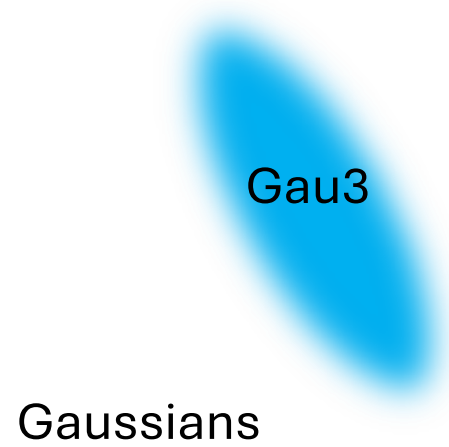
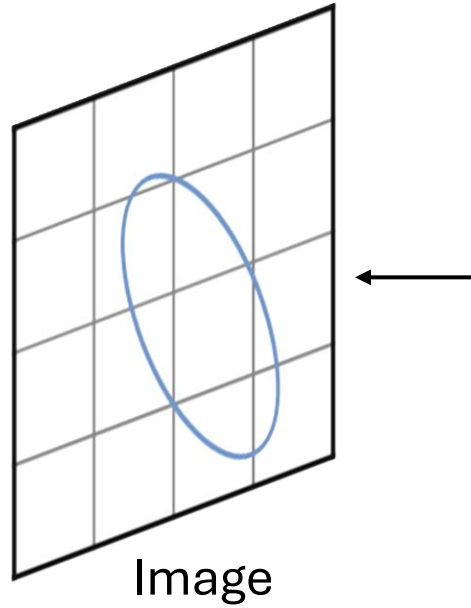
† Qualcomm AI Research is an initiative of Qualcomm Technologies, Inc

Motivation



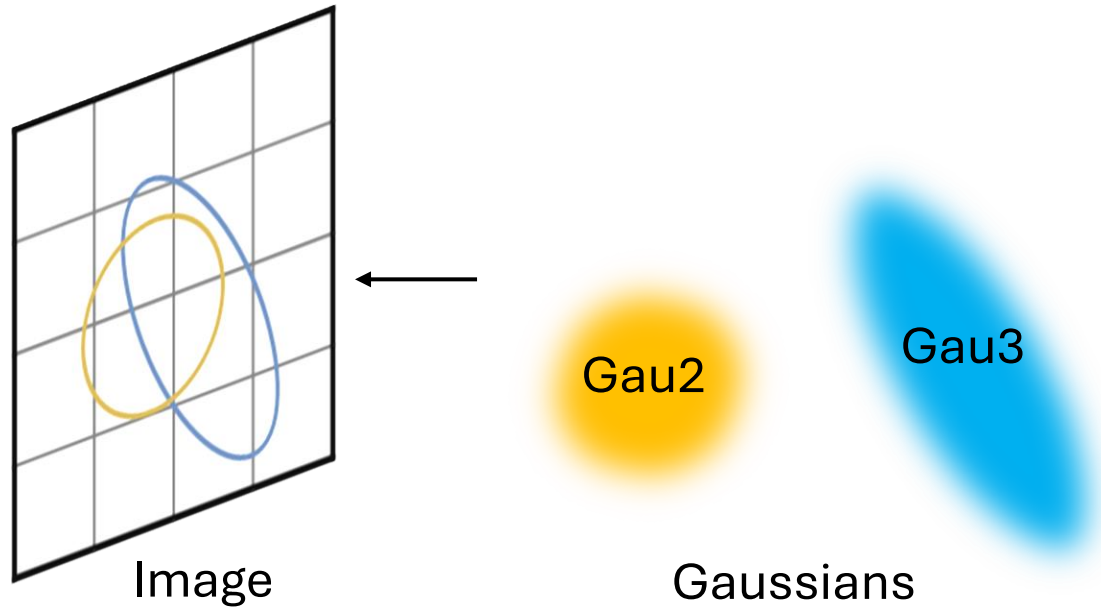
Gaussian Splatting

Motivation



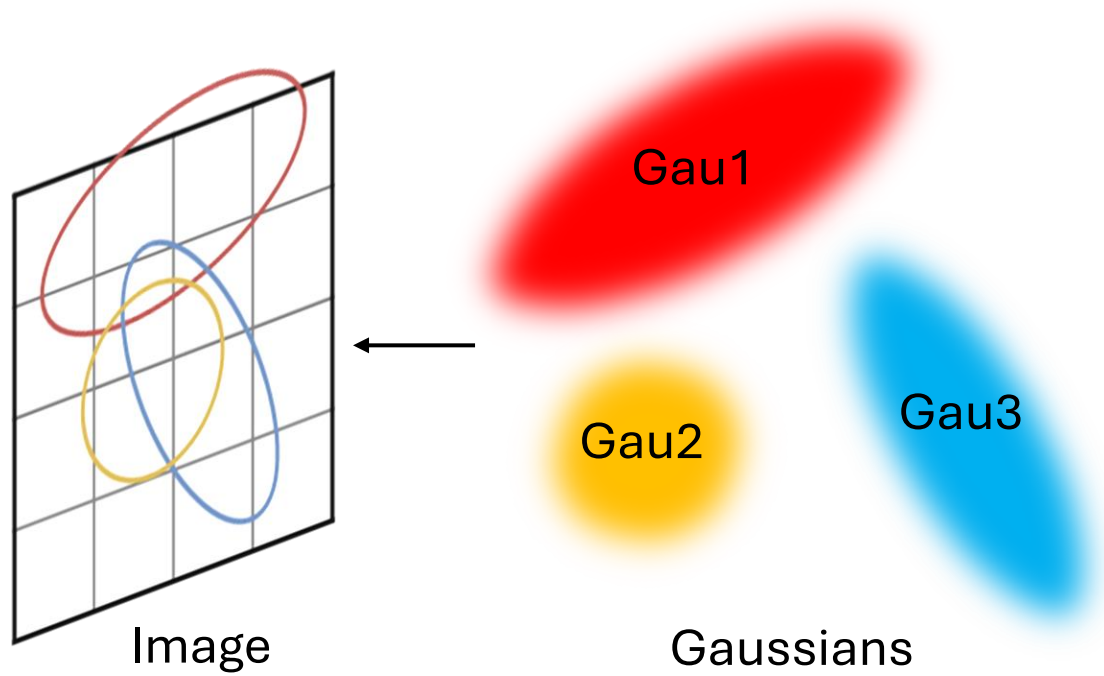
Gaussian Splatting

Motivation



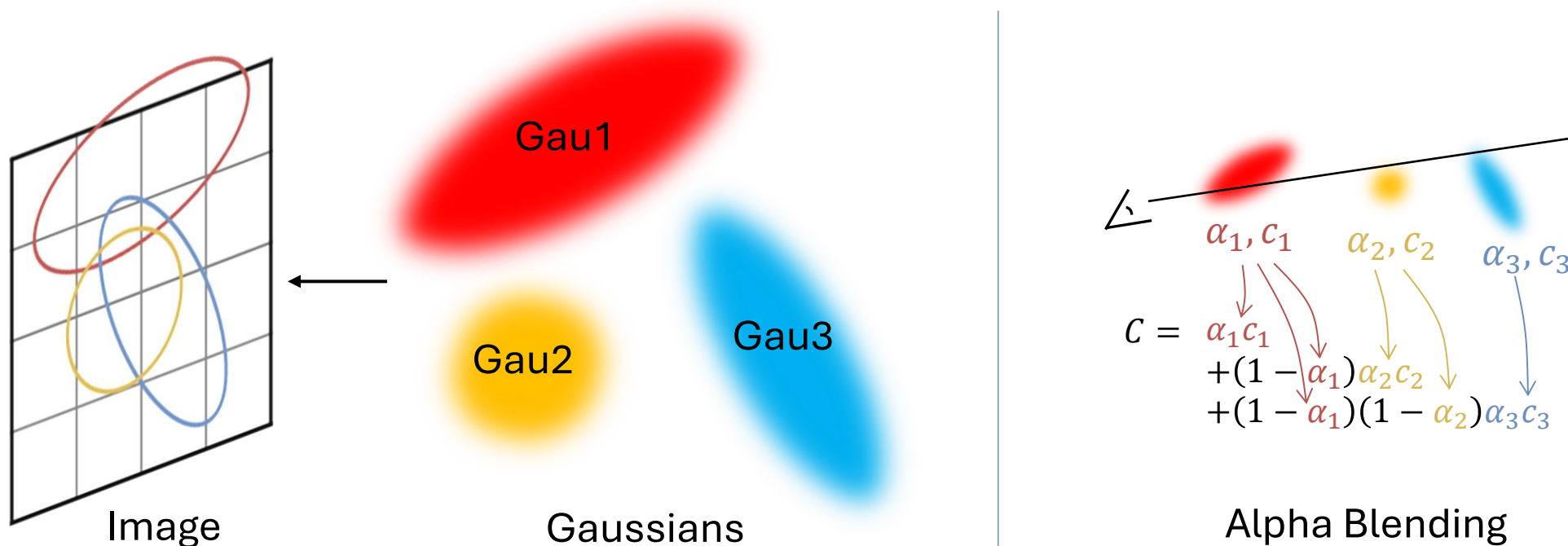
Gaussian Splatting

Motivation



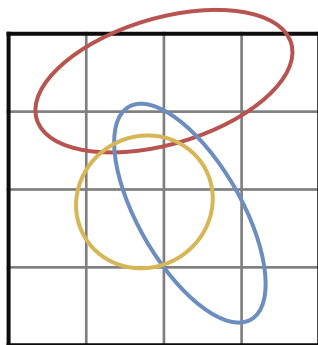
Gaussian Splatting

Motivation



Gaussian Splatting

Motivation

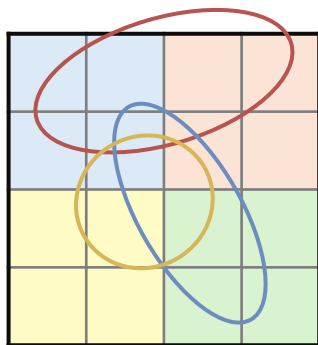


Tiling

Gaussian Splatting Rendering

3DGS splits the rendered image into multiple non-overlapping tiles.

Motivation



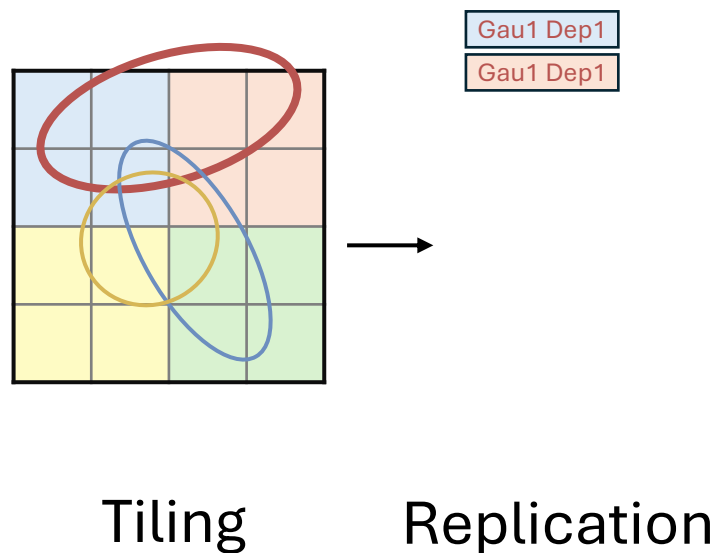
Tiling

e.g. 16 x 16 pixels

Tiling

3DGS splits the rendered image into multiple non-overlapping tiles.

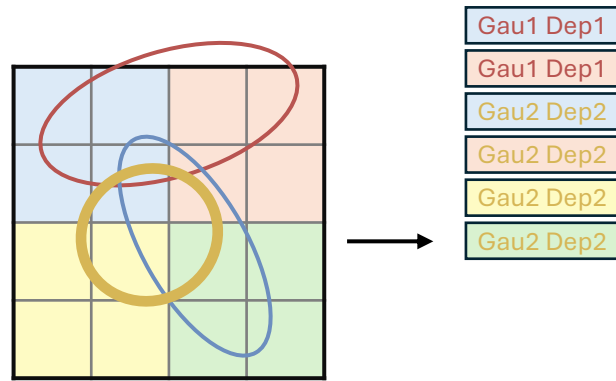
Motivation



Replication

Gaussians that span across **multiple tiles** being duplicated accordingly

Motivation



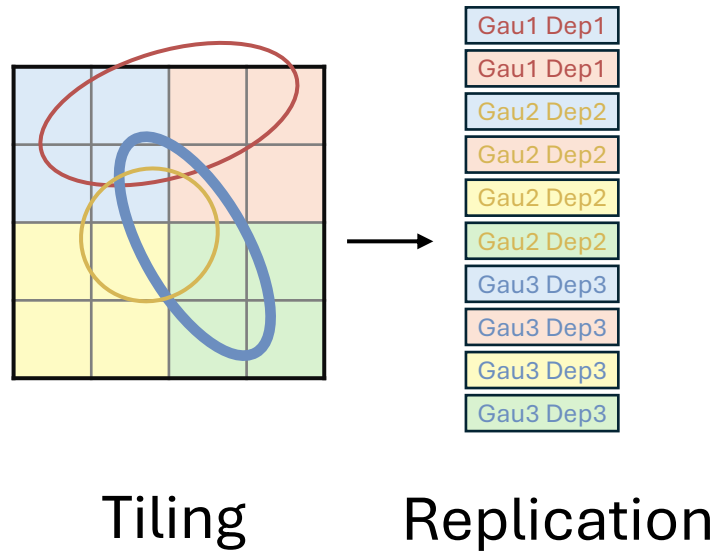
Tiling

Replication

Replication

Gaussians that span across **multiple tiles** being duplicated accordingly

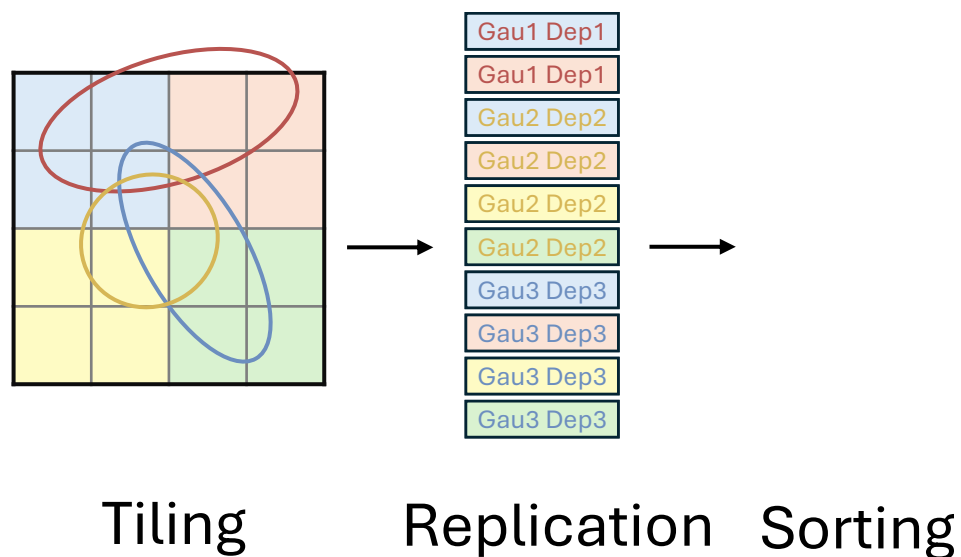
Motivation



Replication

Gaussians that span across **multiple tiles** being duplicated accordingly

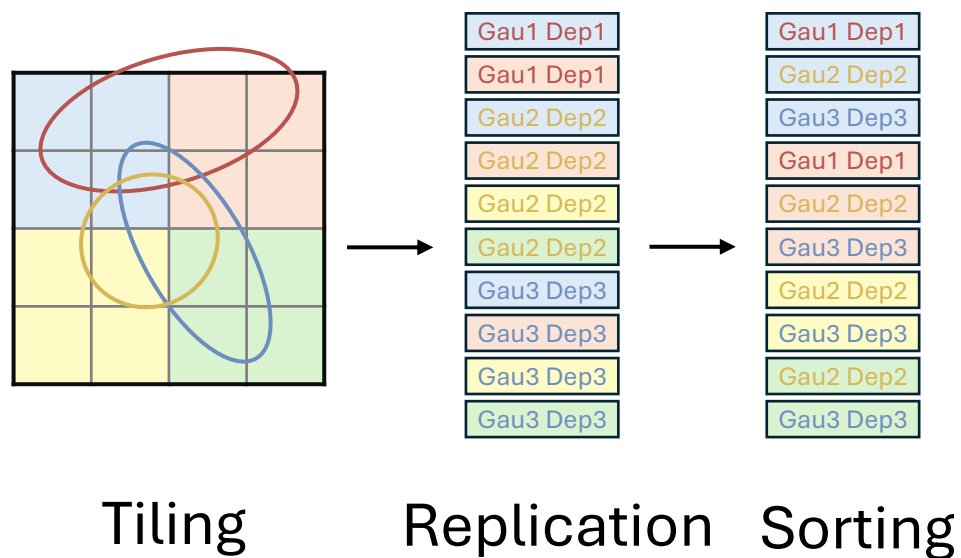
Motivation



Sorting

3DGS sort the Gaussians according to the **depth**.

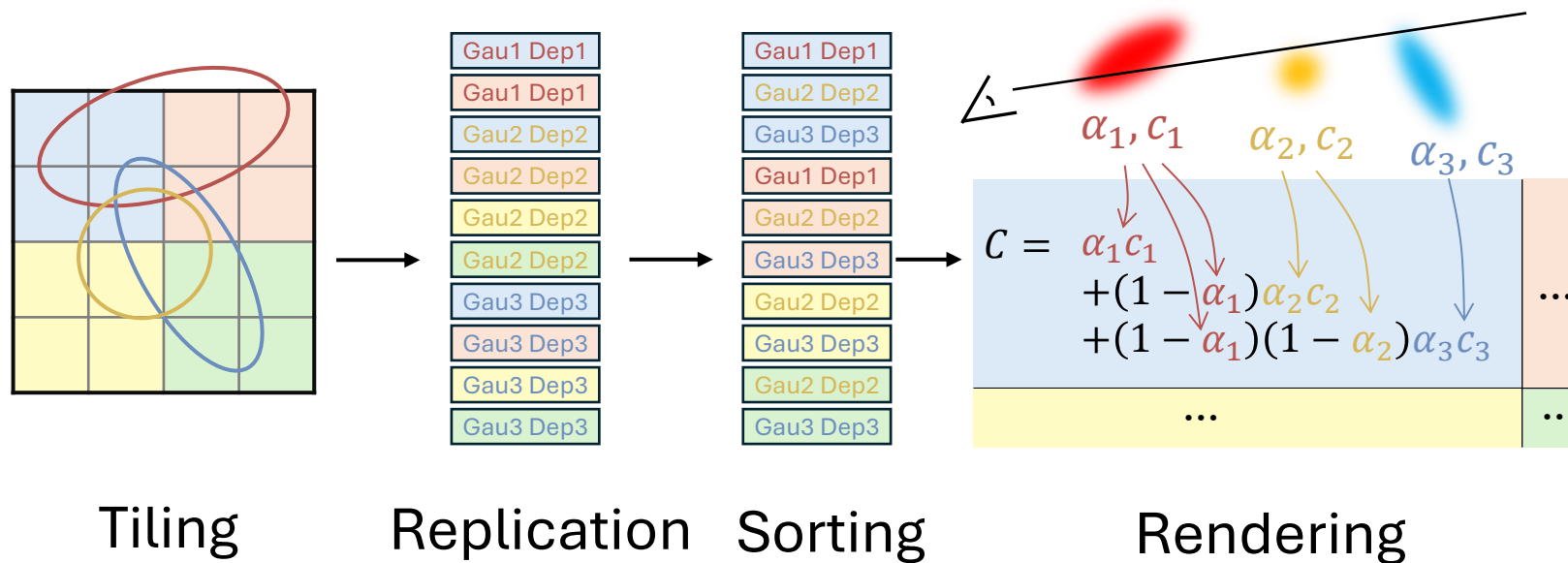
Motivation



Sorting

3DGS sort the Gaussians according to the **depth**.

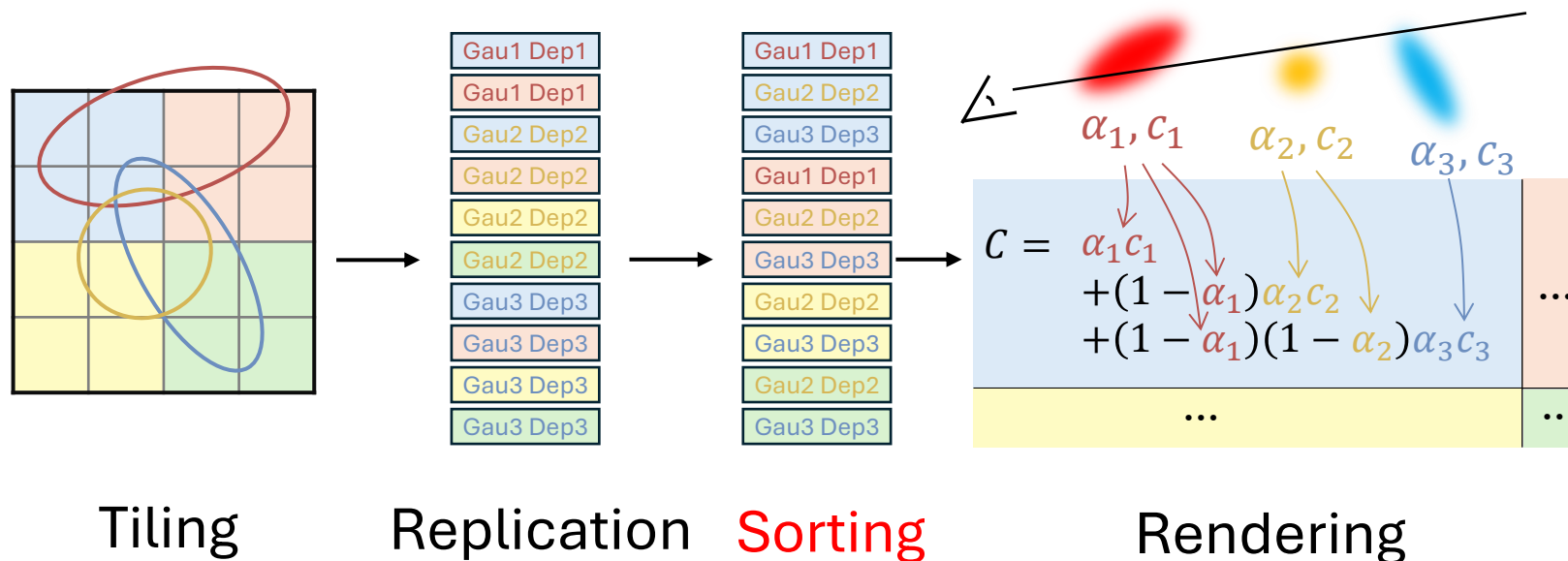
Motivation



Alpha blending

3DGS relies on **non-commutative** alpha blending.

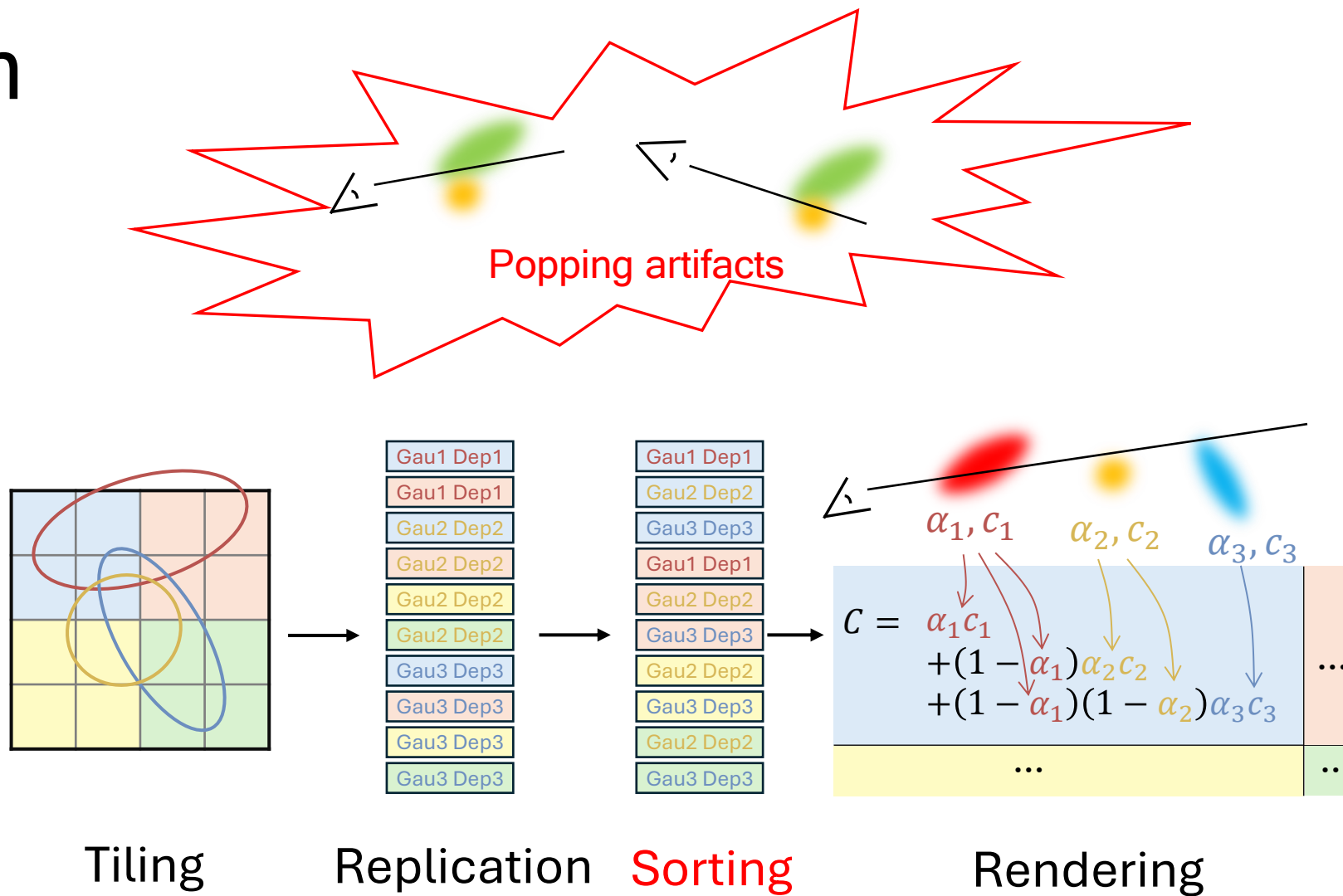
Motivation



Sorting is not friendly for **GPU Hardware Rasterization**

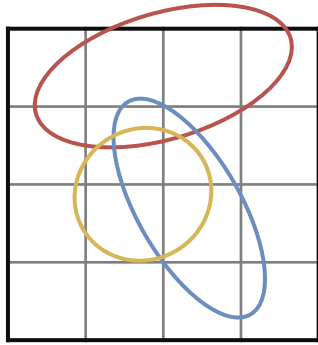
It introduces **computational** overhead and **memory** bottlenecks.

Motivation



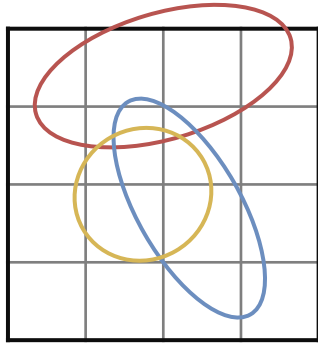
Sorting introduces popping artifacts

Our method



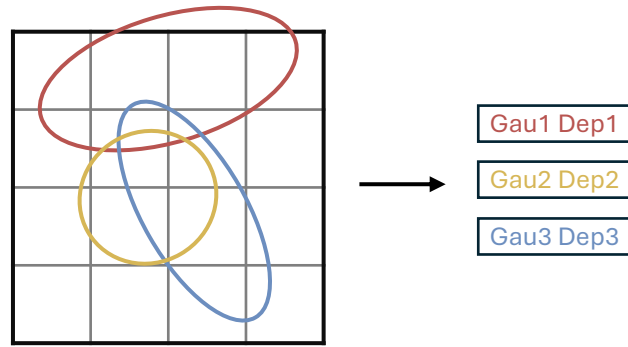
Can we **remove** sorting in 3DGS?

Our method



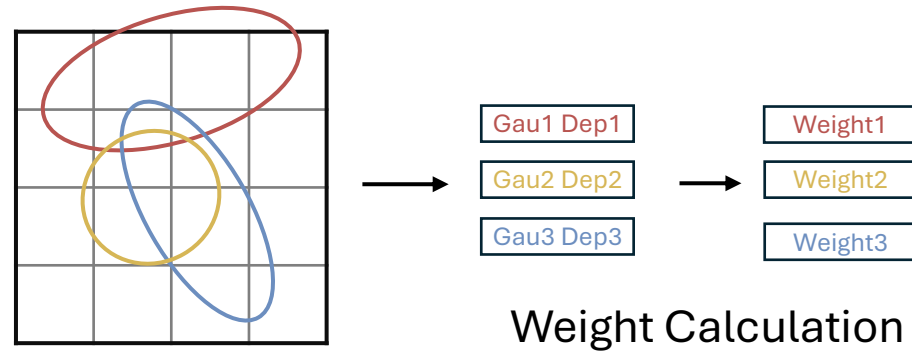
Sort-free Gaussian Splatting

Our method



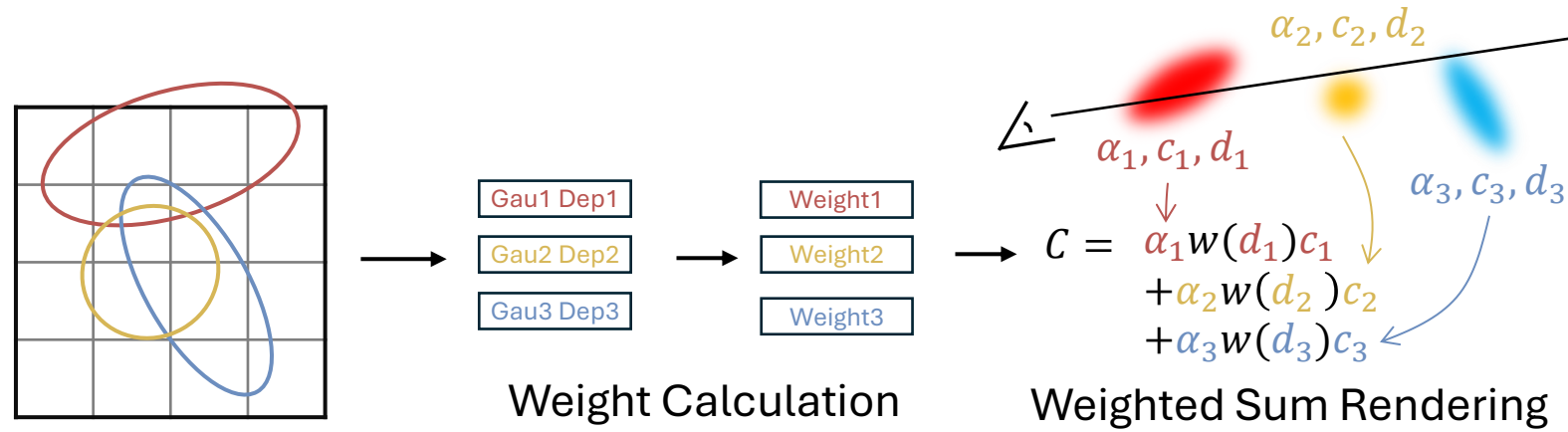
Sort-free Gaussian Splatting

Our method



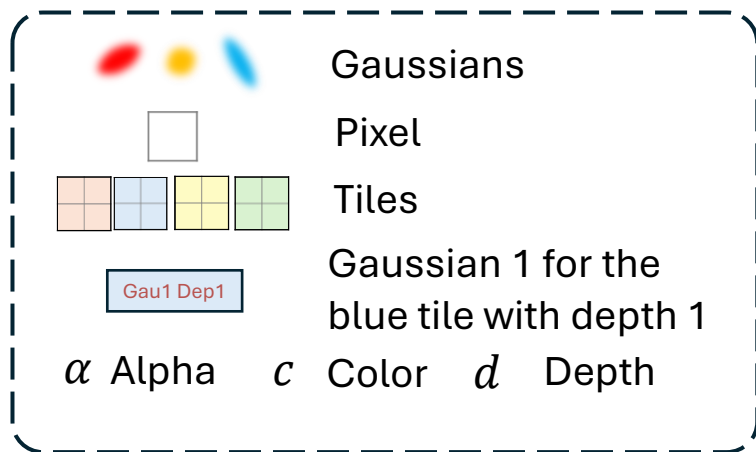
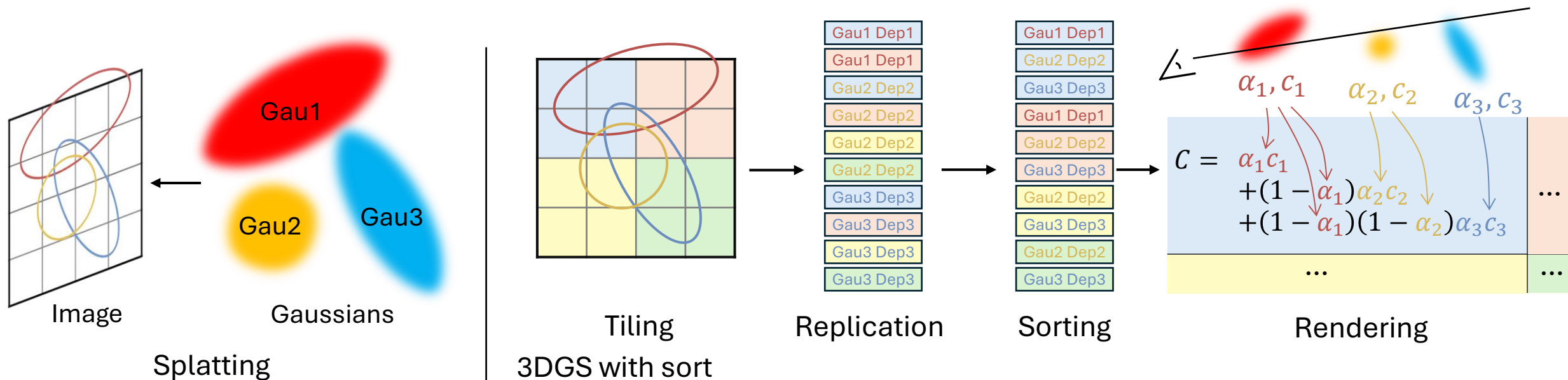
Sort-free Gaussian Splatting

Our method

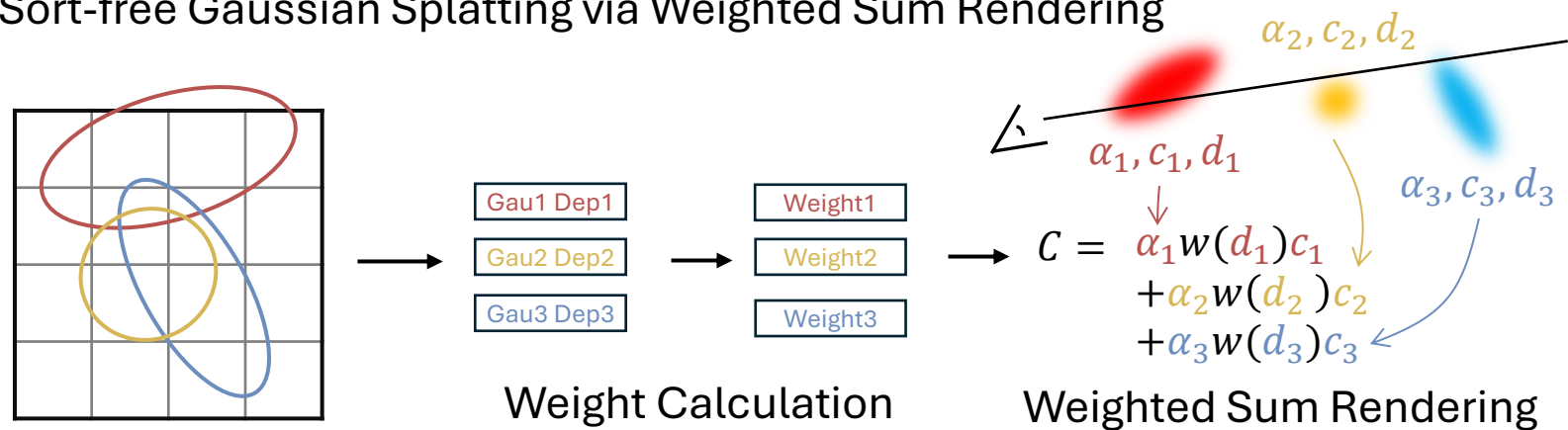


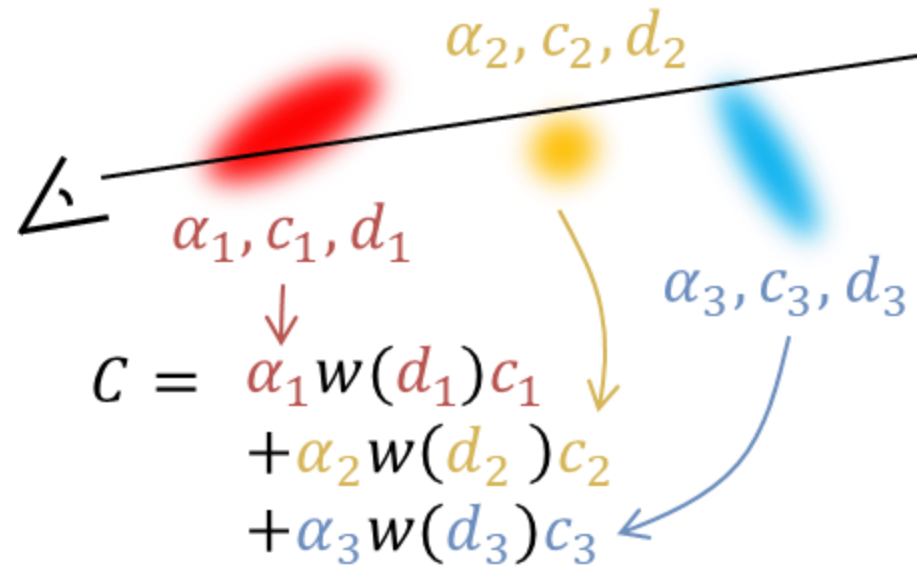
Sort-free Gaussian Splatting

Our method



Sort-free Gaussian Splatting via Weighted Sum Rendering

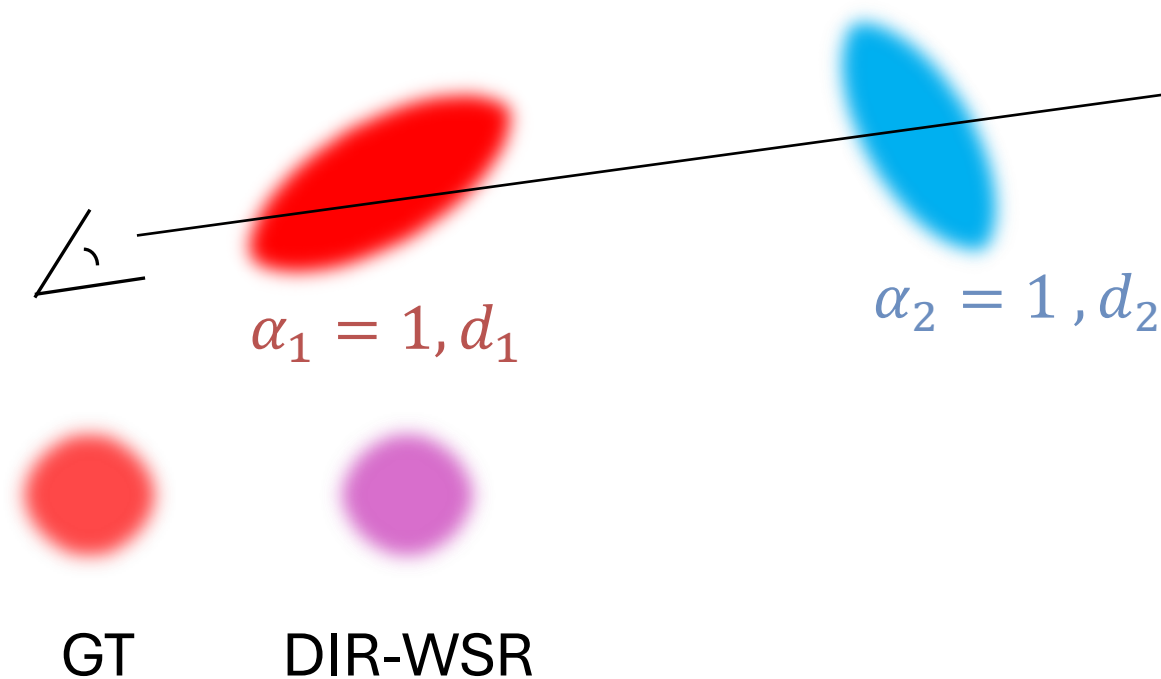




$$\mathbf{C} = \frac{\mathbf{c}_B w_B + \sum_{i=1}^N \mathbf{c}_i \alpha_i w(d_i)}{w_B + \sum_{i=1}^N \alpha_i w(d_i)}$$

Weighted Sum Rendering

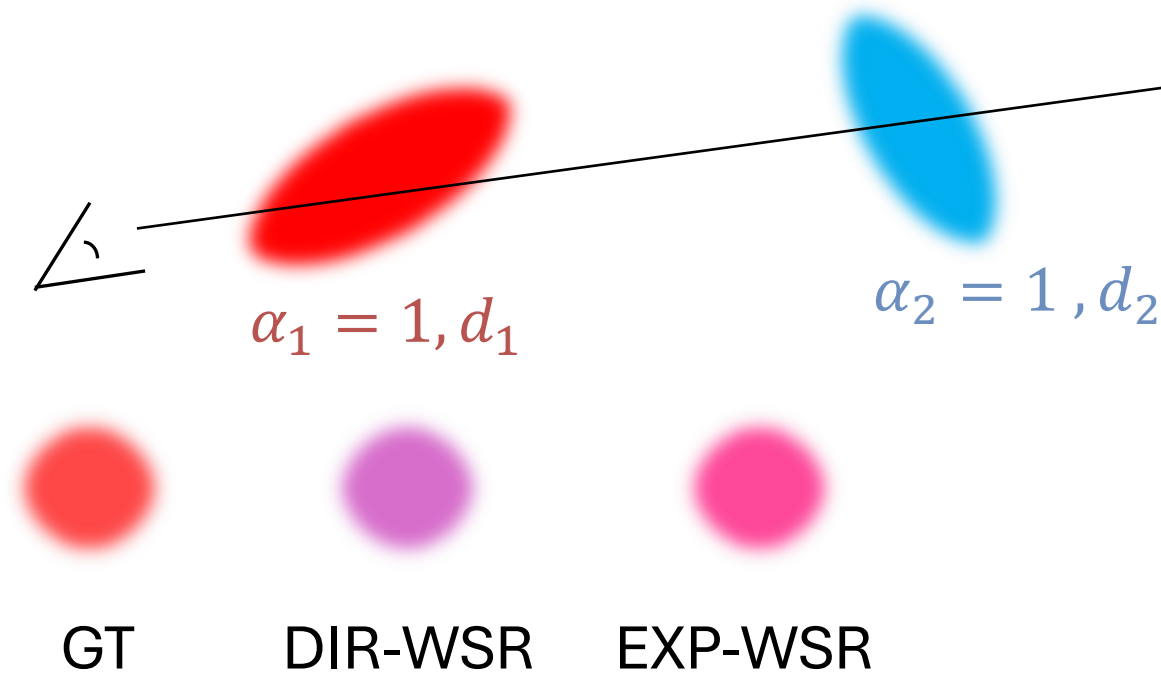
How to define the weight function $w(d)$, and alpha?



$$w(d_i) = 1$$

Direct Weighted Sum Rendering

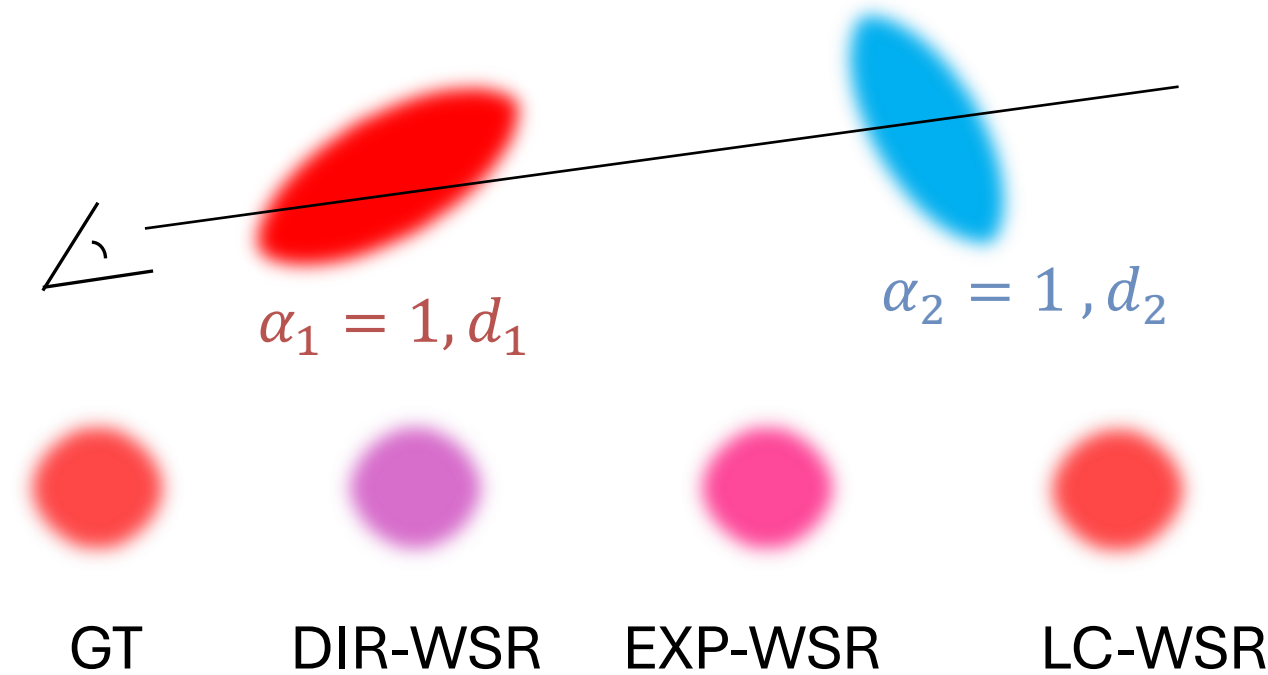
No learnable parameter.



$$w(d_i) = \exp(-\sigma d_i^\beta)$$

Exponential Weighted Sum Rendering

Learnable parameters σ and β enable to produce more accurate results.

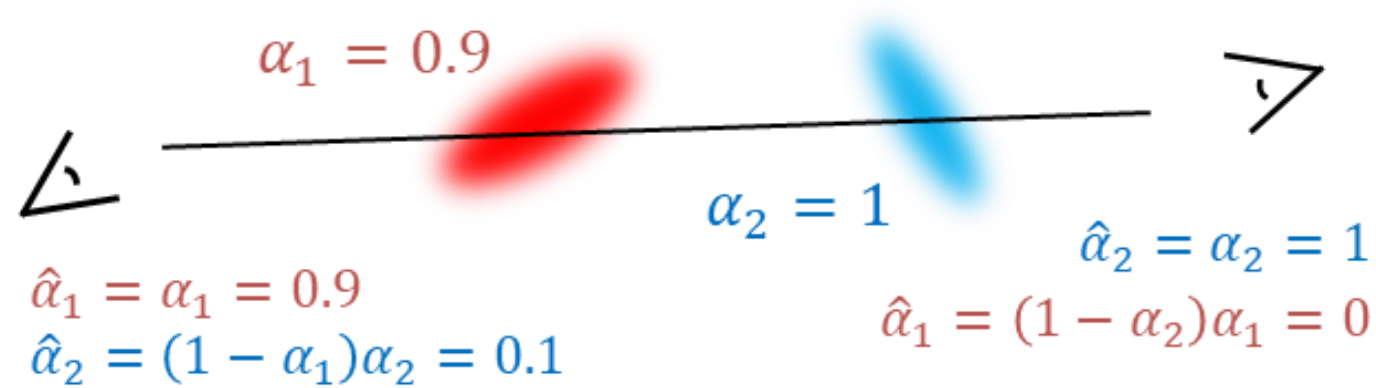


$$w(d_i) = \max\left(0, 1 - \frac{d_i}{\sigma}\right) v_i$$

Linear Correction Weighted Sum Rendering

ReLU like function. Never used in OIT. We are the first to use it in rendering.

View dependent opacity



$$u_i = Y(\|\mathbf{f} - \mathbf{p}_i\|, \mathbf{H}_i)$$

View dependent opacity

$Y(\cdot)$ indicates the spherical harmonic function and $\mathbf{H}_i$ indicates the learnable spherical harmonics coefficients for opacity.

Experiments

Method	Mip-NeRF 360			Tanks & Temples			Deep Blending		
	PSNR $\uparrow$	SSIM $\uparrow$	LPIPS $\downarrow$	PSNR $\uparrow$	SSIM $\uparrow$	LPIPS $\downarrow$	PSNR $\uparrow$	SSIM $\uparrow$	LPIPS $\downarrow$
Plenoxels	23.08	0.626	0.463	21.08	0.719	0.379	23.06	0.795	0.510
INGP-Base	25.30	0.671	0.371	21.72	0.723	0.330	23.62	0.797	0.423
INGP-Big	25.59	0.699	0.331	21.92	0.745	0.305	24.96	0.817	0.390
M-NeRF360	27.69	0.792	0.237	22.22	0.759	0.257	29.40	0.901	0.245
3DGS	27.21	0.815	0.214	23.14	0.841	0.183	29.41	0.903	0.243
LC-WSR	27.19	0.804	0.211	23.61	0.842	0.177	29.63	0.902	0.229

Quantitative Results

Experiments



Dr Johnson (LC-WSR)



GT(PSNR↑)



3DGS(30.66)



DIR-WSR(32.72)



EXP-WSR(33.07)



LC-WSR(33.49)



Room (LC-WSR)



GT(PSNR↑)



3DGS(30.20)



DIR-WSR(28.71)



EXP-WSR(30.87)



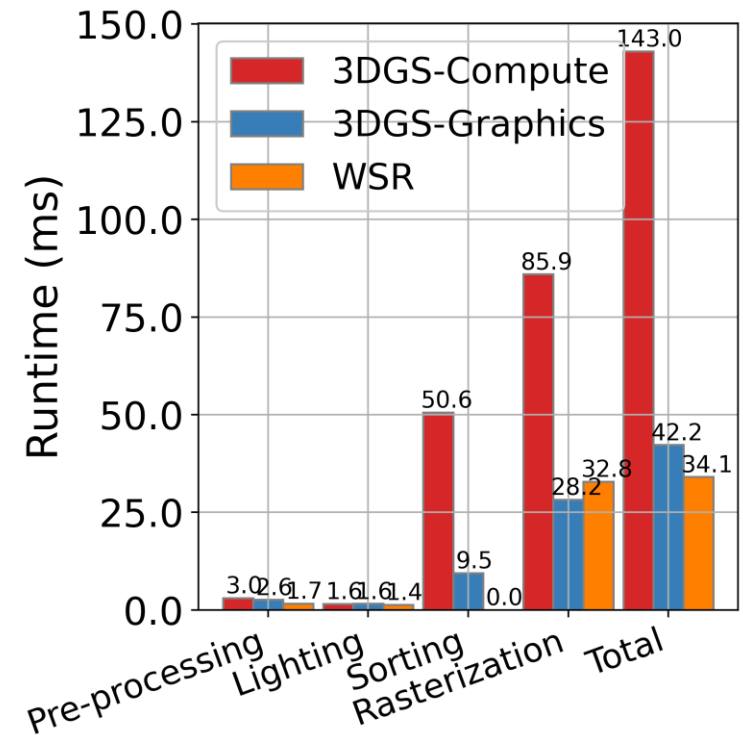
LC-WSR(32.72)

Qualitative Results

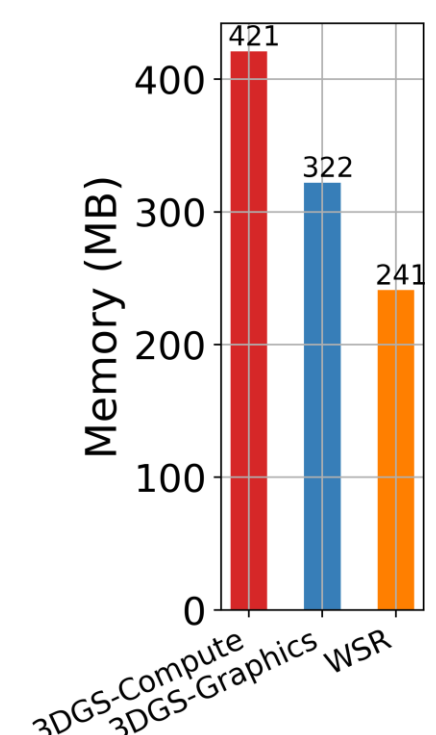
Experiments

3DGS-Compute: Port 3DGS CUDA kernels to Vulkan **compute shaders**

3DGS-Graphics: Global sorting followed by **hardware rasterization**



Runtime Comparison



Memory Comparison

On Snapdragon 8 gen 3 at **1920x1080**

Pop Artifacts

Moving along z -direction

Thank you!

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