



Interactive Path Tracing and Reconstruction of Sparse Volumes

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Presenter: Chanhyeok Lee



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Introduction

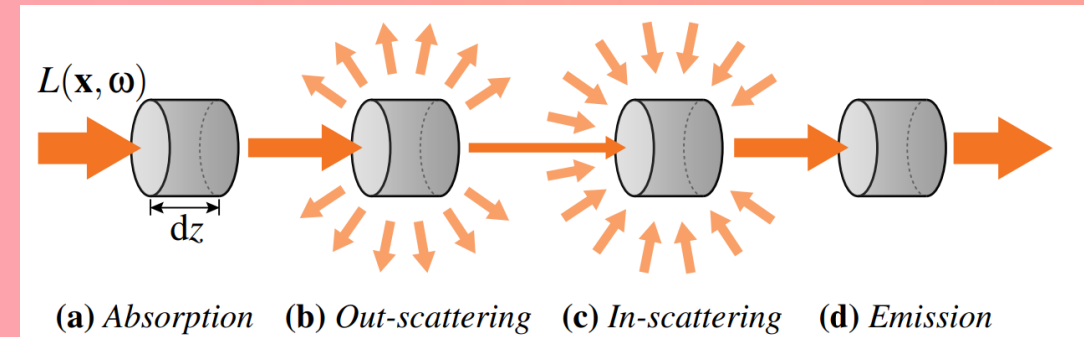
- 👑 Path tracing is well established and now widely used
- 👑 Difficult to leverage graphic hardware with grid a voxel grid
- 👑 SOTA rendering + neural denoising



Introduction – Background

👑 Rendering with Participating Media

$$(\omega \cdot \nabla)L(\mathbf{x}, \omega) = \mu_a(\mathbf{x})L(\mathbf{x}, \omega) - \mu_s(\mathbf{x})L(\mathbf{x}, \omega) + \mu_s(\mathbf{x})L_s(\mathbf{x}, \omega) + \mu_a(\mathbf{x})L_e(\mathbf{x}, \omega) ,$$

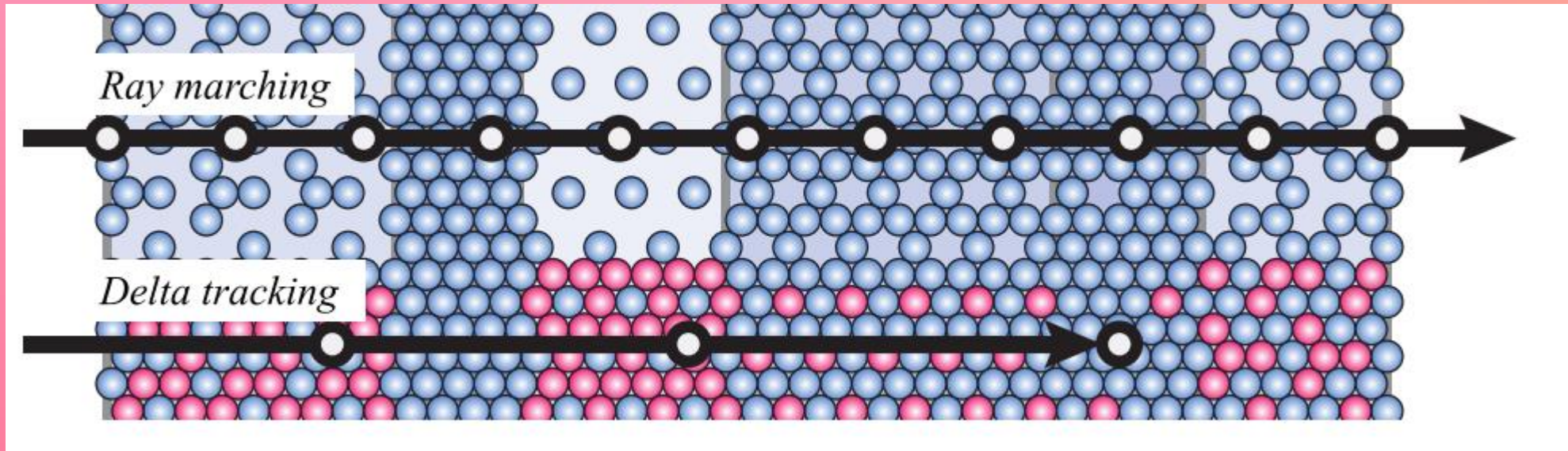


$$L(\mathbf{x}, \omega) = \int_0^\infty T(\mathbf{x}, \mathbf{y}) [\mu_a(\mathbf{y})L_e(\mathbf{y}, \omega) + \mu_s(\mathbf{y})L_s(\mathbf{y}, \omega)] d\mathbf{y} .$$



Introduction – Background

👑 Null Collision Algorithm



Introduction – Background

- 👑 Denoising
- 👑 Many samples: high quality, long time
- 👑 Trade-off: Quality vs. time
- 👑 Less samples + Neural Denoiser → high quality, short time



Renderer

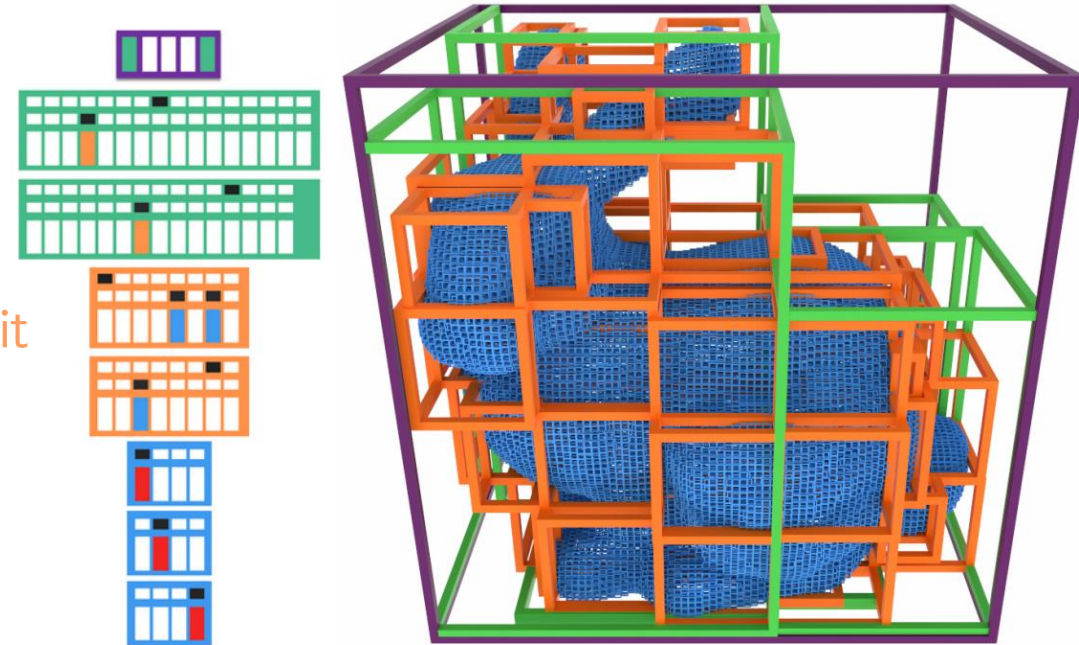
▶ Path Tracer

👑 Multiple importance sampling

Important sampled shadow ray + Accidental light probe hit

👑 Sparse voxel Tree

more time to traverse; memory efficient



Renderer

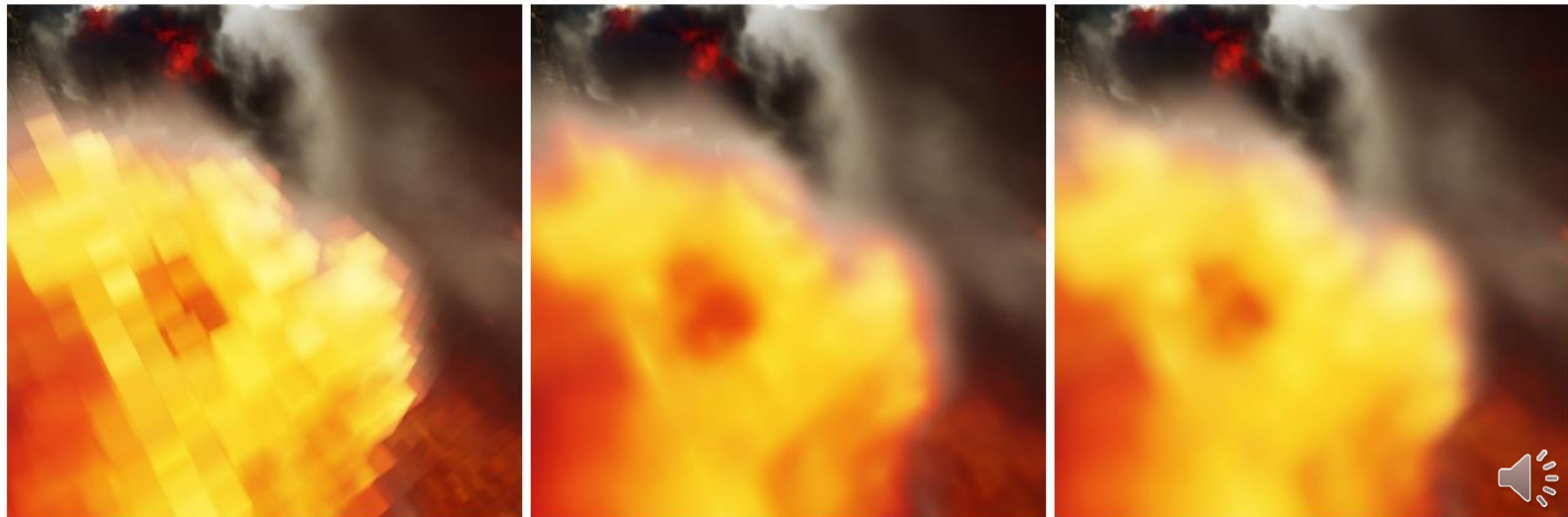
▶ Volume Filtering

👑 The volume is a discrete grids

➔ Blocky structure

👑 Interpolation is costly

➔ Monte Carlo Integration!!!



Renderer

▶ Emission Sampling

- 👑 Another Grid for temperature
- 👑 Collision while delta tracking → Temperature lookup
- 👑 TF: $(r, g, b) = (t, t^2, t^4)^2$

▶ Work Load Balancing

- 👑 Random sampling + multiple scattering → high variance of paths → inappropriate with GPU
- 👑 Two-step rendering: Queue a ray corresponding each pixel, then dequeuer all rays and trace



Renderer

▶ Adaptive Sampling

👑 At global queuing

▶ Empty Space Skipping

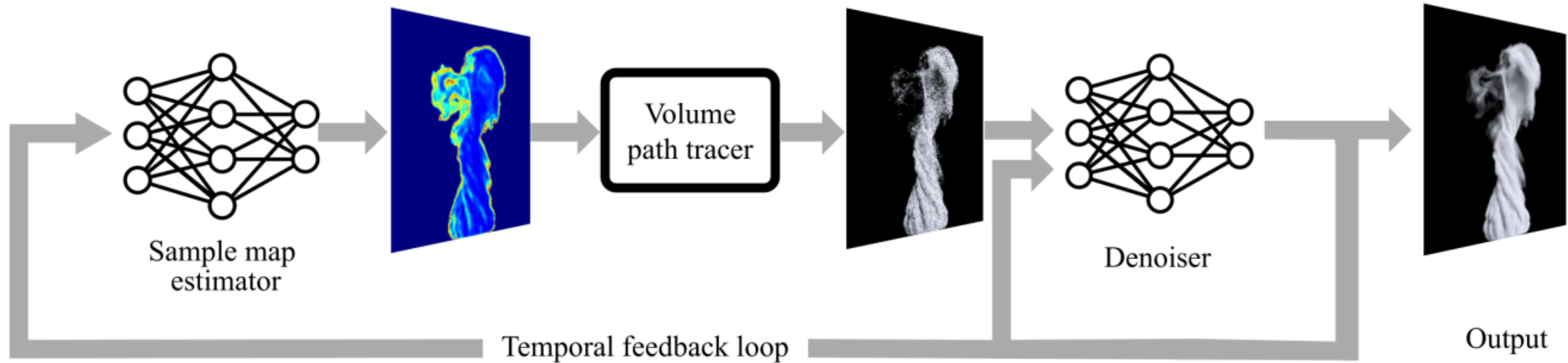
👑 Leveraged by hierarchical bounding boxes

👑 Delta tracking within a volume until a real collision volume bound escape



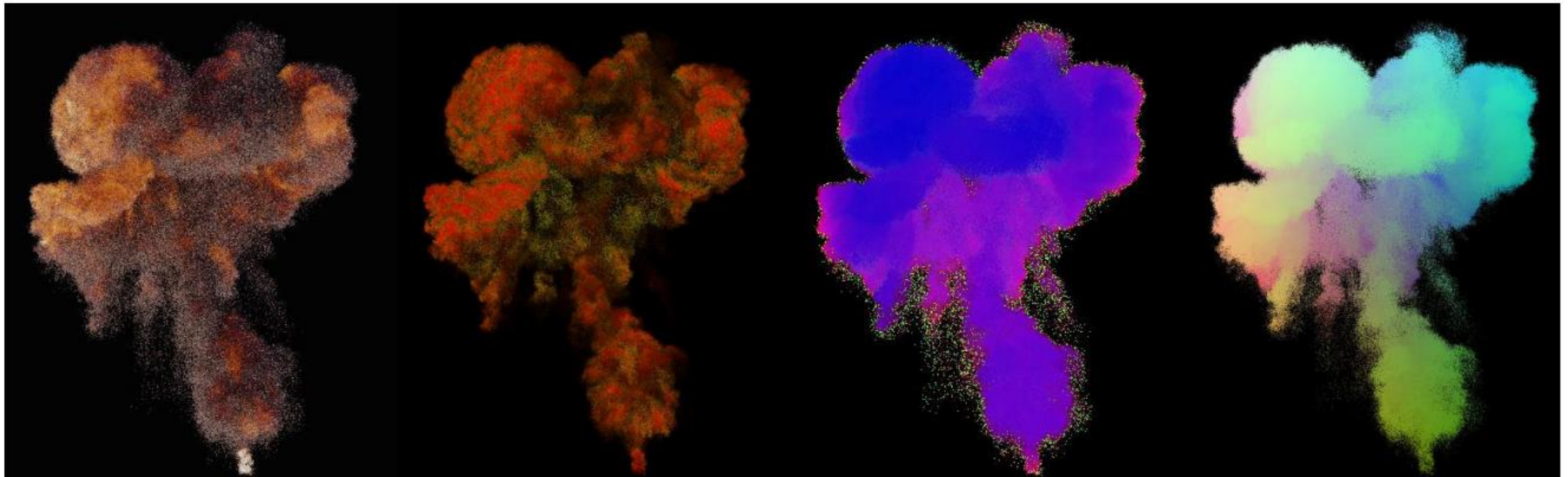
Denoising – Network Architecture

► Data flow



Denoising – Network Architecture

▶ Network inputs



color

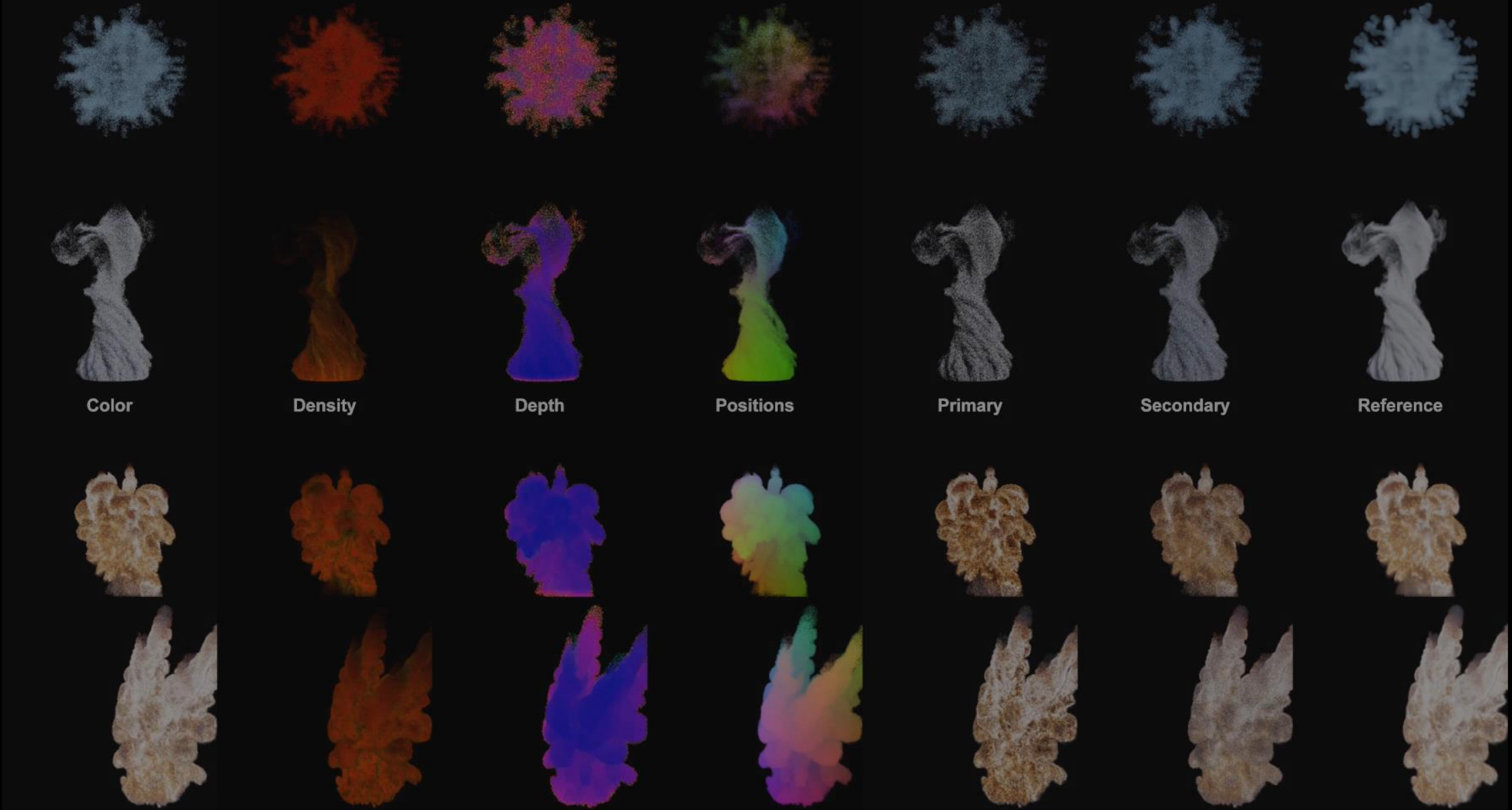
density

depth

position

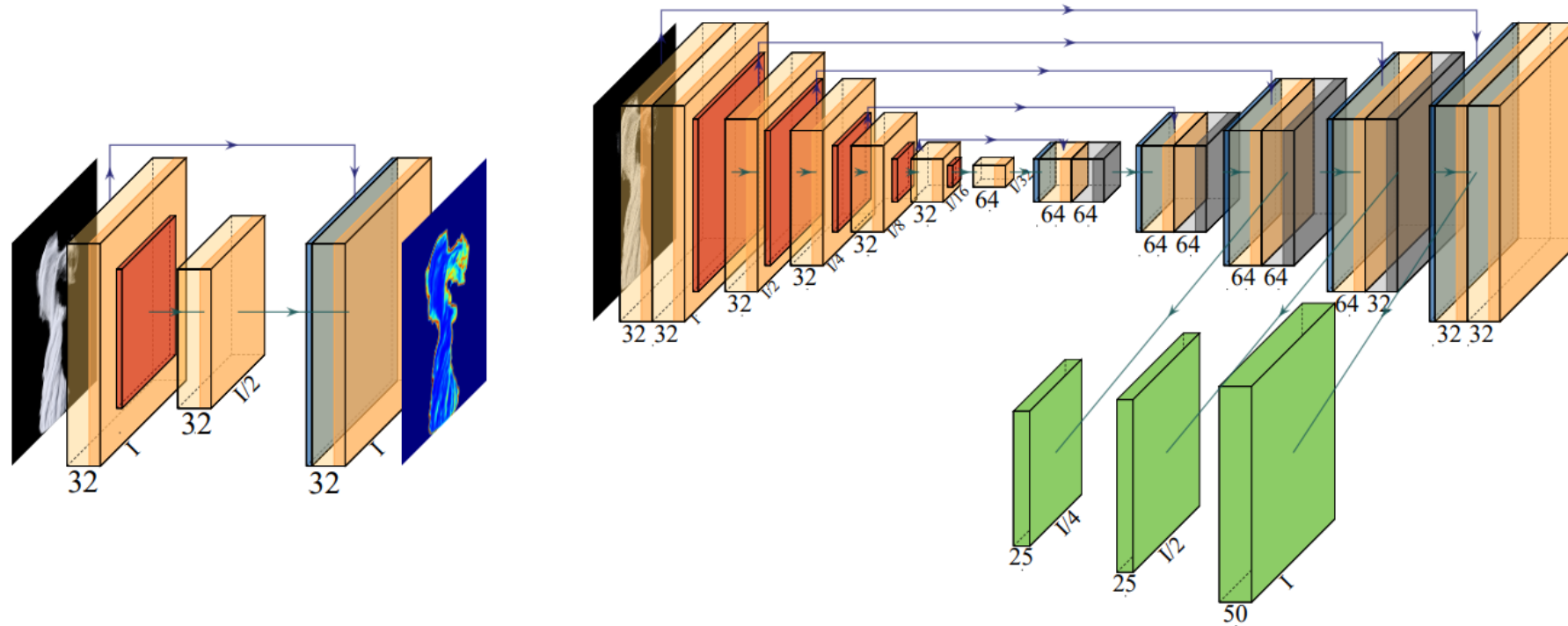


Feature Guides



Denoising – Network Architecture

► Network architecture



Denoising – Training and Dataset

- 👑 1000 clips from a set of volumes
- 👑 Input: path tracing result with 1-32 spp
- 👑 Target: path tracing result with 4096 spp
- 👑 Objective function

$$\text{SMAPE}(\mathbf{r}, \mathbf{d}) = \frac{1}{3N} \sum_{p \in N} \sum_{c \in C} \frac{|\mathbf{d}_{p,c} - \mathbf{r}_{p,c}|}{|\mathbf{d}_{p,c}| + |\mathbf{r}_{p,c}| + \epsilon}.$$

$$\text{tSMAPE}(\Delta_r, \Delta_d, \mathbf{r}, \mathbf{d}) = \frac{1}{3N} \sum_{p \in N} \sum_{c \in C} \frac{|\Delta_{\mathbf{d}_{p,c}} - \Delta_{\mathbf{r}_{p,c}}|}{|\mathbf{d}_{p,c}| + |\mathbf{r}_{p,c}| + \epsilon}.$$



Evaluation – Runtime Performance

	4 spp uniform					
Scene	#Voxels	#Paths	Render	Denoise	Σ	FPS
DUST DEVIL	2.5M	1.4M	8.6	7.3	15.9	63
GASOLINE EXPLOSION	3.6M	1.6M	8.9	7.3	16.2	61
BUILDING IMPLOSION	4.0M	2.8M	8.4	7.3	15.7	64
MIDAIR EXPLOSION	5.4M	2.7M	16.5	7.3	23.8	42
SMOKE PLUME	11.4M	1.6M	20.1	7.3	27.4	36
DISNEY CLOUD	188.4M	5.3M	53.4	7.3	60.7	16

	4 spp adaptive					
Scene	#Voxels	#Paths	Render	Denoise	Σ	FPS
DUST DEVIL	2.5M	5.3M	27.8	7.3 + 3.1	38.2	26
GASOLINE EXPLOSION	3.6M	6.1M	31.4	7.3 + 3.1	41.8	24
BUILDING IMPLOSION	4.0M	8.3M	22.6	7.3 + 3.1	33.0	30
MIDAIR EXPLOSION	5.4M	8.3M	50.1	7.3 + 3.1	60.5	17
SMOKE PLUME	11.4M	6.1M	79.5	7.3 + 3.1	89.9	11
DISNEY CLOUD	188.4M	8.5M	86.4	7.3 + 3.1	96.8	10



Evaluation – Runtime Performance

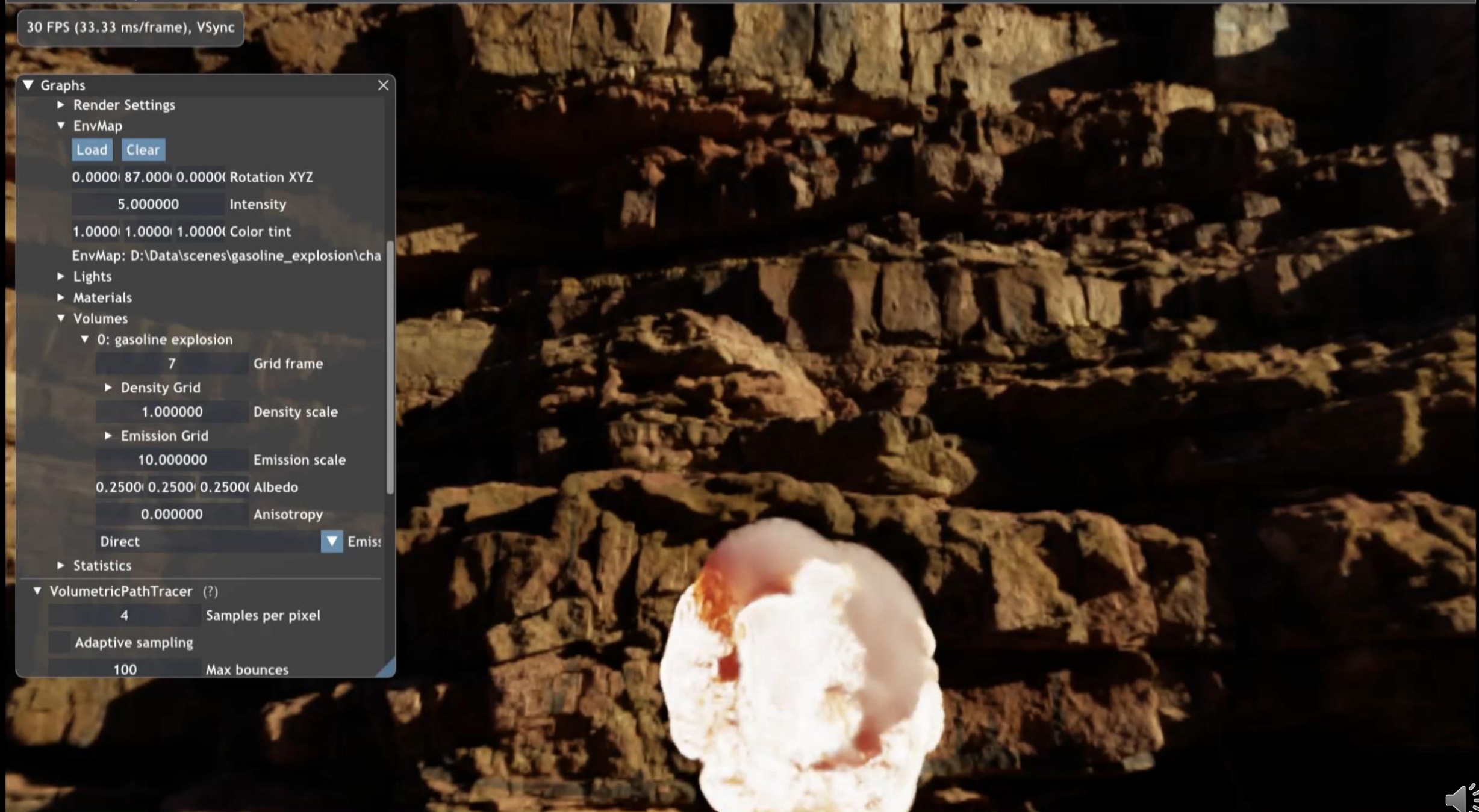
Contributions to speedup

DISNEY CLOUD, 4 spp (ms)	On	Off	Speedup
Next-event estimation	278.0	150.8	×0.54
Stochastic interpolation	87.2	278.0	×3.19
Load balancing	63.2	87.2	×1.38
Empty space skipping	53.4	63.2	×1.18



▼ Graphs

- ▶ Render Settings
- ▼ EnvMap
 - Load Clear
 - 0.0000| 87.000| 0.0000(Rotation XYZ
 - 5.000000 Intensity
 - 1.0000| 1.0000| 1.0000(Color tint
 - EnvMap: D:\Data\scenes\gasoline_explosion\cha
- ▶ Lights
- ▶ Materials
- ▼ Volumes
 - ▼ 0: gasoline explosion
 - 7 Grid frame
 - ▶ Density Grid
 - 1.000000 Density scale
 - ▶ Emission Grid
 - 10.000000 Emission scale
 - 0.2500| 0.2500| 0.2500(Albedo
 - 0.000000 Anisotropy
 - Direct ▼ Emis:
 - ▶ Statistics
- ▼ VolumetricPathTracer (?)
 - 4 Samples per pixel
 - Adaptive sampling
 - 100 Max bounces



Evaluation – Denoiser Ablation Studies

Feature Guides

Influence of guides	relMSE	SMAPE	PSNR
Color	0.0199	0.0238	35.37
Color + guides	0.0185	0.0234	35.48

Network size

Network size	relMSE	SMAPE	PSNR
Color	0.0199	0.0238	35.37
Color 2x weights	0.0185	0.0236	35.47
Color 4x weights	0.0198	0.0238	35.51
Color + guides	0.0185	0.0234	35.48
Color + guides 2x weights	0.0175	0.0228	35.73
Color + guides 4x weights	0.0211	0.0230	35.75



Evaluation – Denoiser Ablation Studies

Adaptive Sampling

Uniform vs. Adaptive	relMSE	SMAPE	PSNR
Uniform 4 spp	0.0186	0.0229	35.28
Uniform 8 spp	0.0123	0.0194	36.75
Adaptive (naive) 2 spp	0.0265	0.0253	35.13
Adaptive (naive) 4 spp	0.0167	0.0201	37.26
Adaptive (ours) 2 spp	0.0180	0.0226	35.68
Adaptive (ours) 4 spp	0.0115	0.0188	37.27



Conclusion

- 👑 Unbiased Interactive Volume Rendering in real time!!!!
- 👑 Only single volume → full path tracer with light interactions between volumes + meshes
- 👑 High computational cost to generate training data
- 👑 Further improvement expected

