



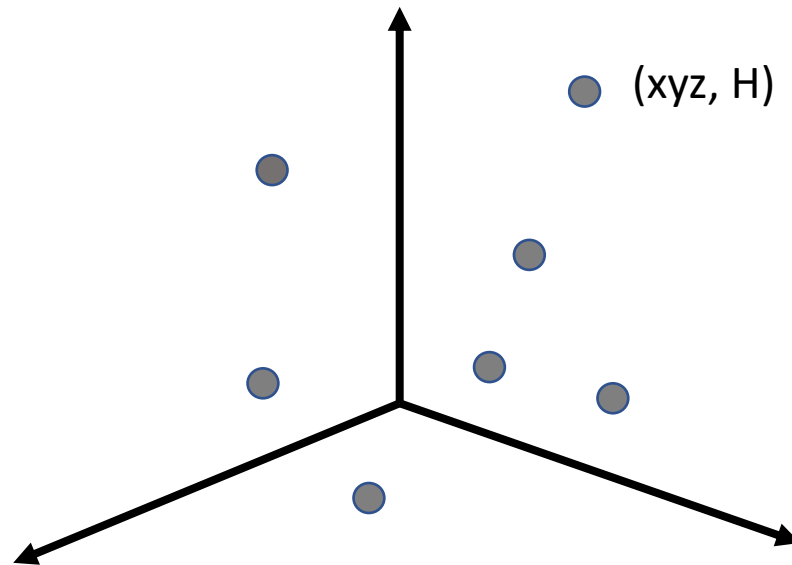
Differentiable Point-Based Radiance Fields for Efficient View Synthesis with imperfect masks

Presenter: Jason Yuan (jcyuan)

Original paper: Qiang Zhang, Szymon Rusinkiewicz, Seung-Hwan Baek, Felix Heide
Siggraph Asia 2022

Background

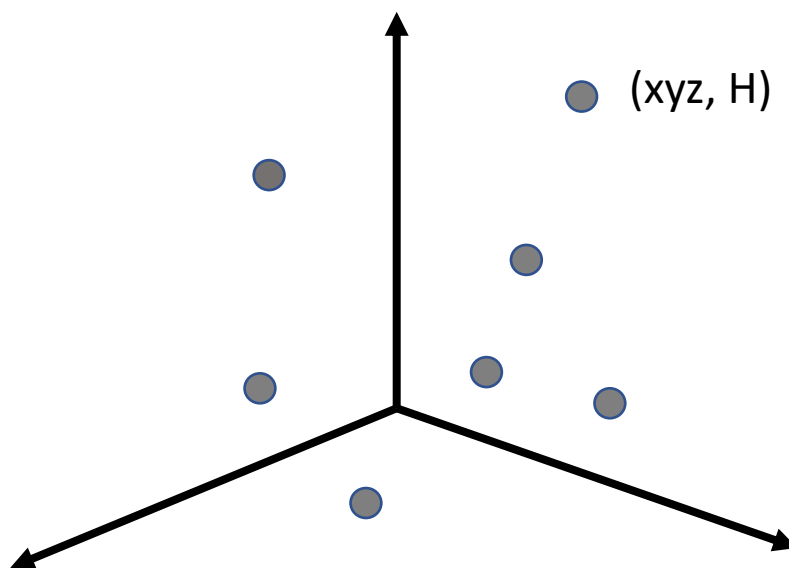
Model: 3D point cloud (xyz) w Radiance parameter (H). *Learnable* parameters. Optimize with SGD



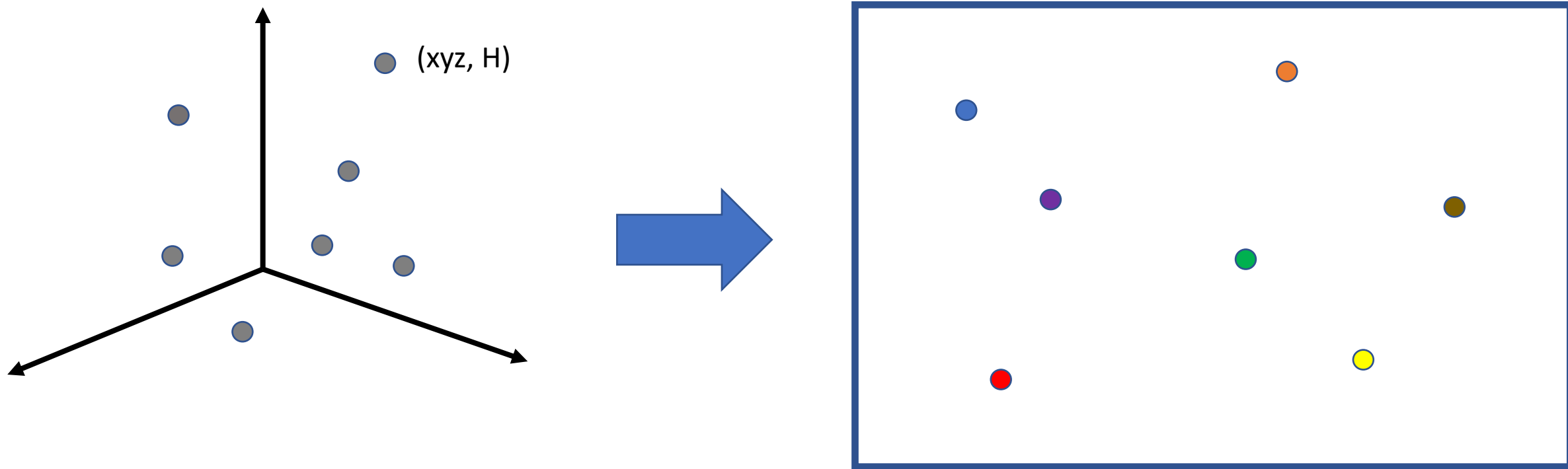
Input: viewing direction (i.e. camera intrinsics/extrinsics info, parameters R, t, M)



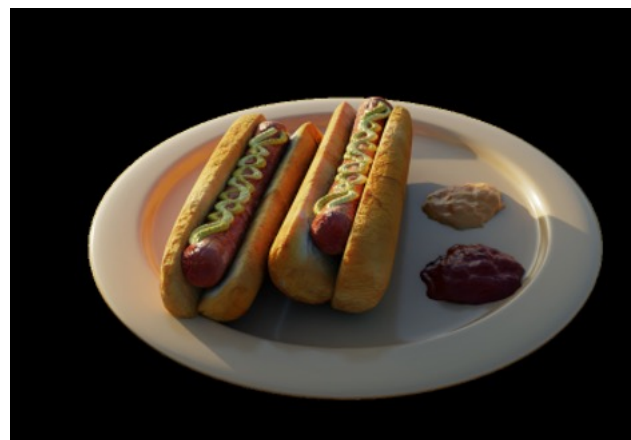
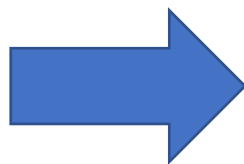
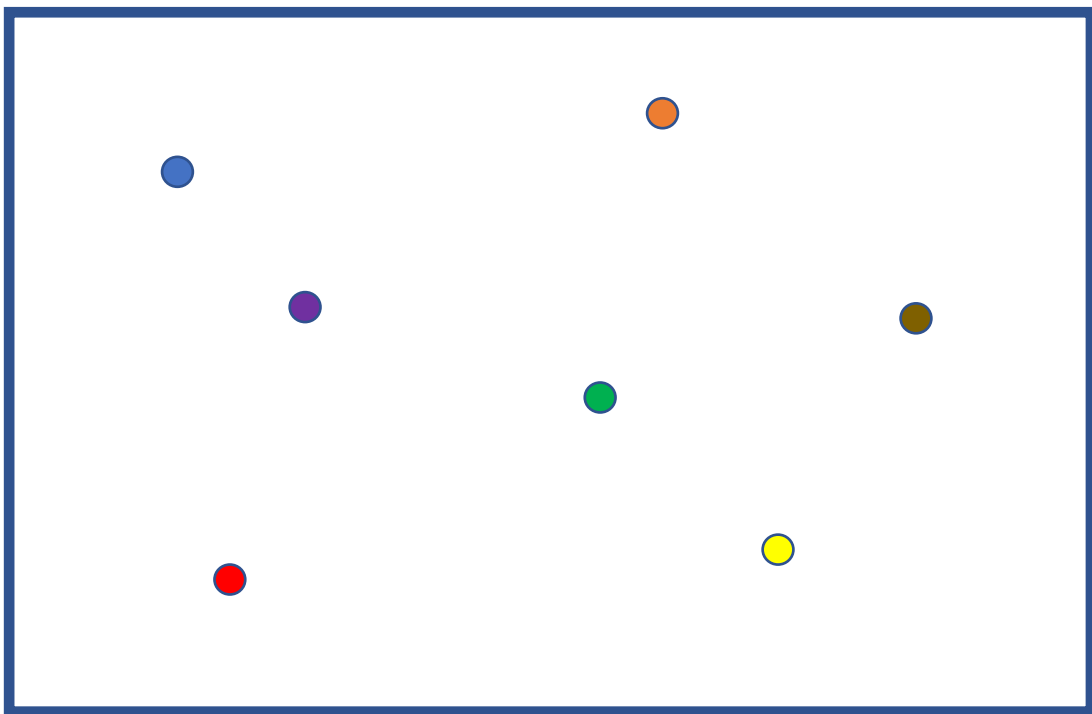
R, t, M



Use R, T, M to project onto 2D and get view-dependent color



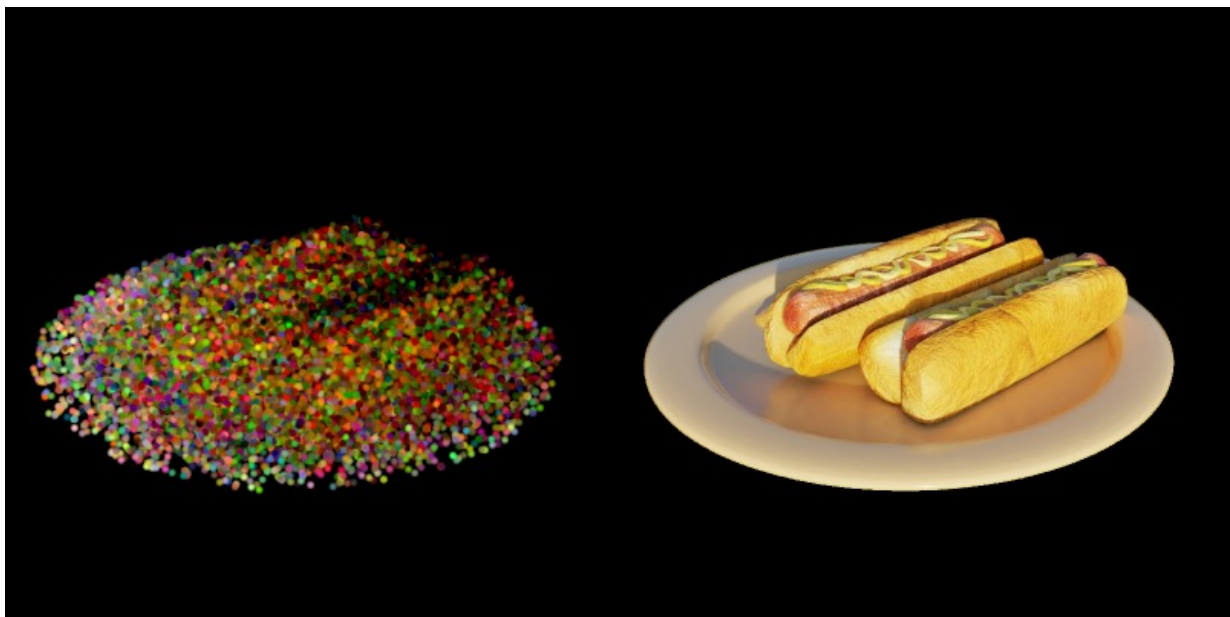
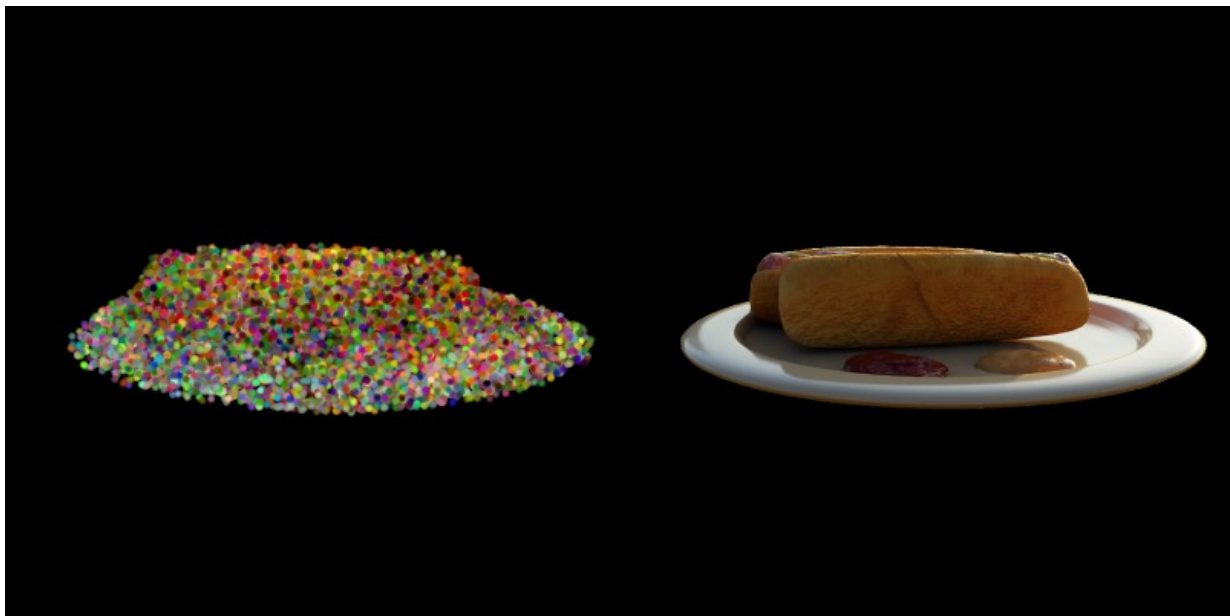
Differentiable splat render the points:



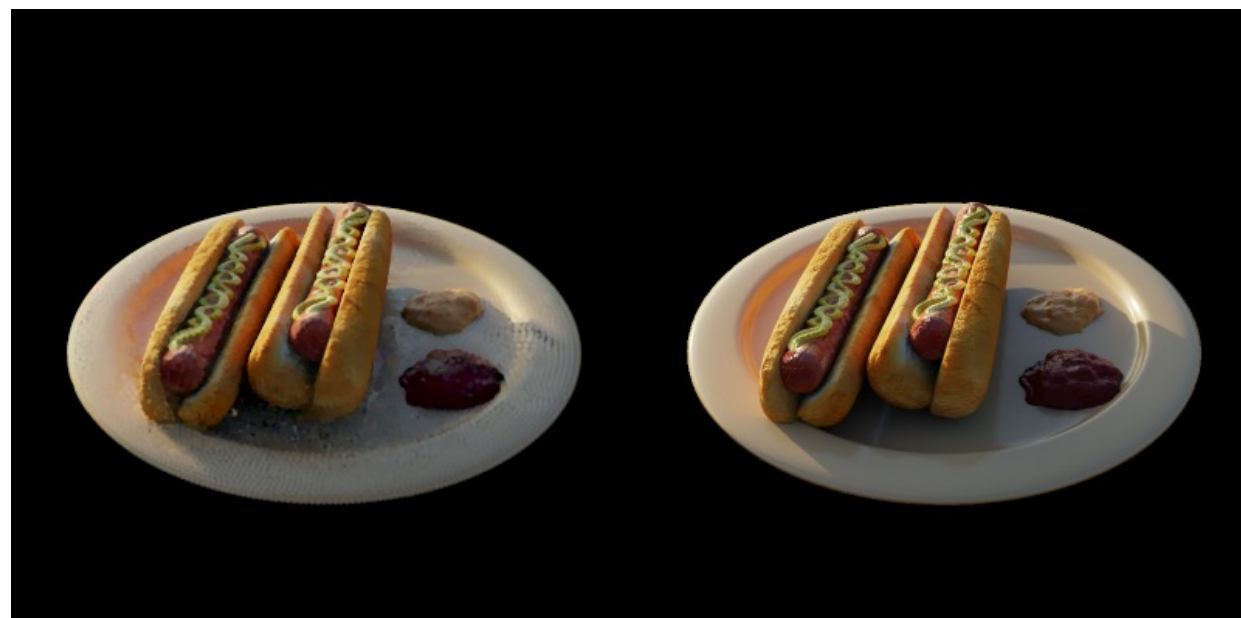
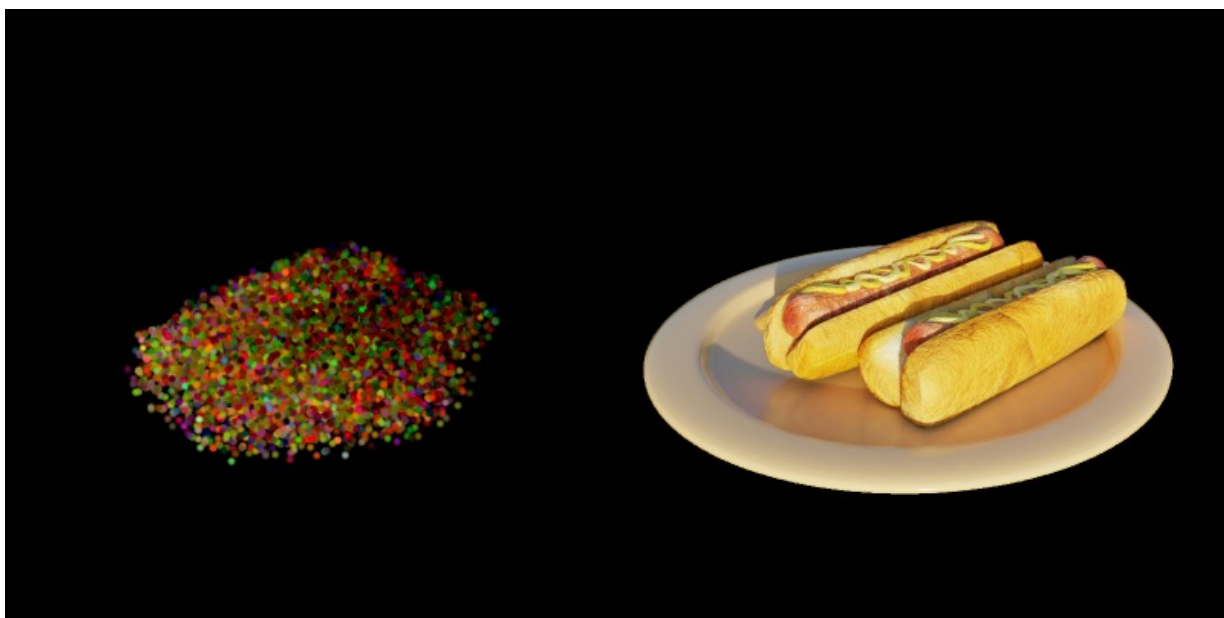
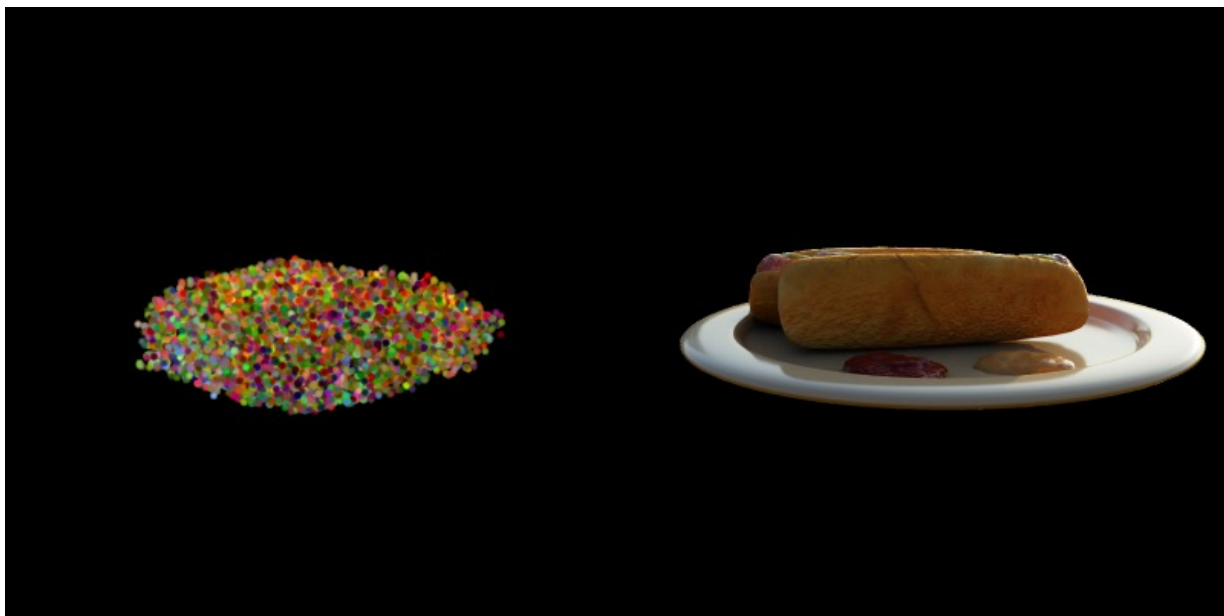
Limitations

- Initialization of the point-cloud relies on having good object masks.
 - The algorithm: initialize points uniformly in where you think the volume is, ie spaces in 3D that fall into all of your masks

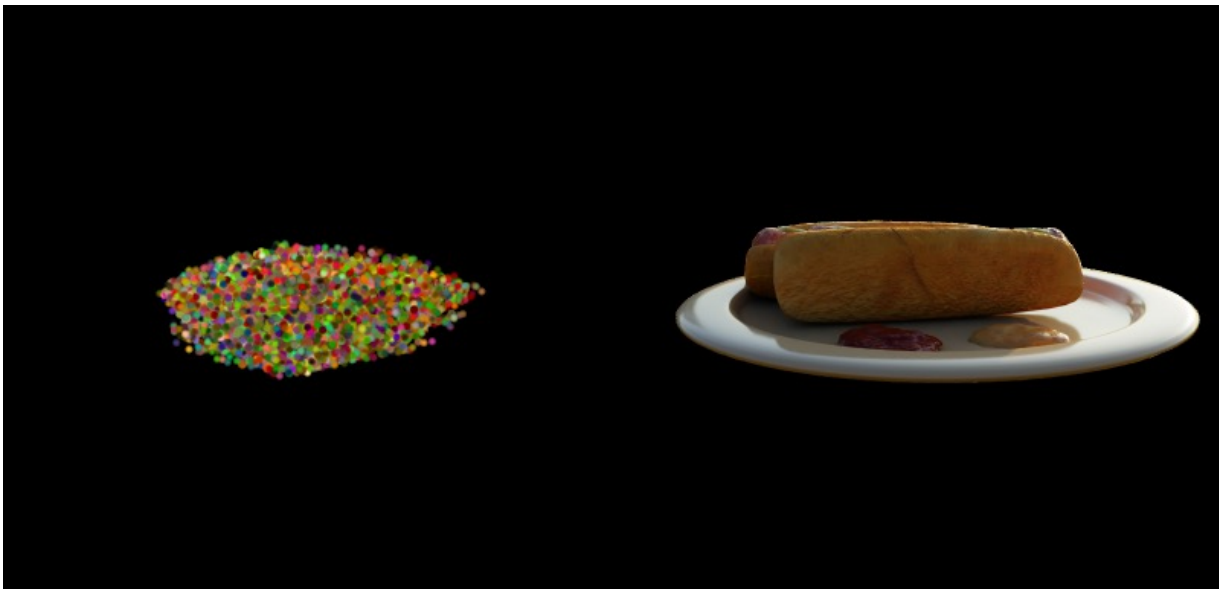
Problem: real world
masks are imperfect



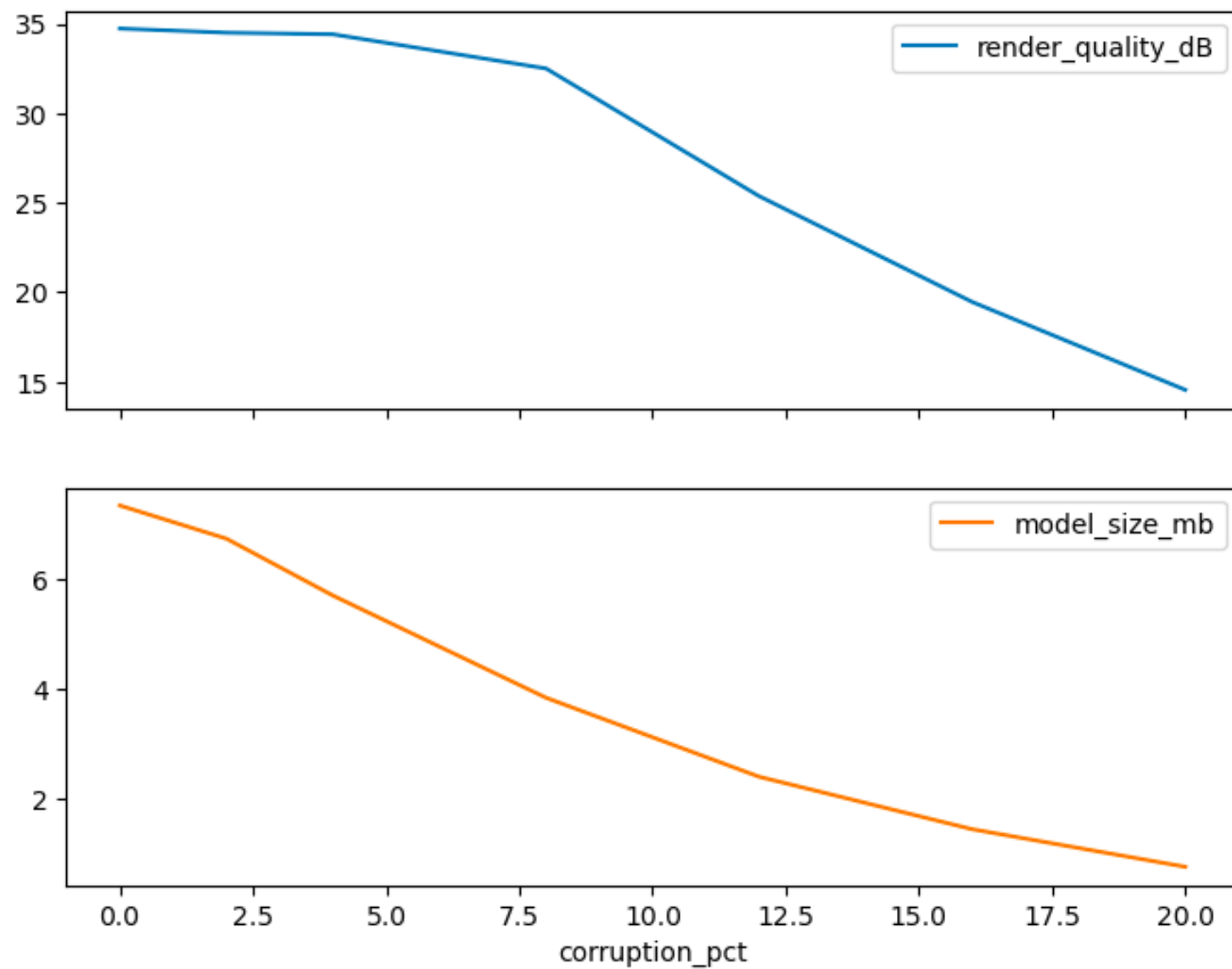
Original: mask is very, very good



8% corruption: initialization not great, quality worsens,

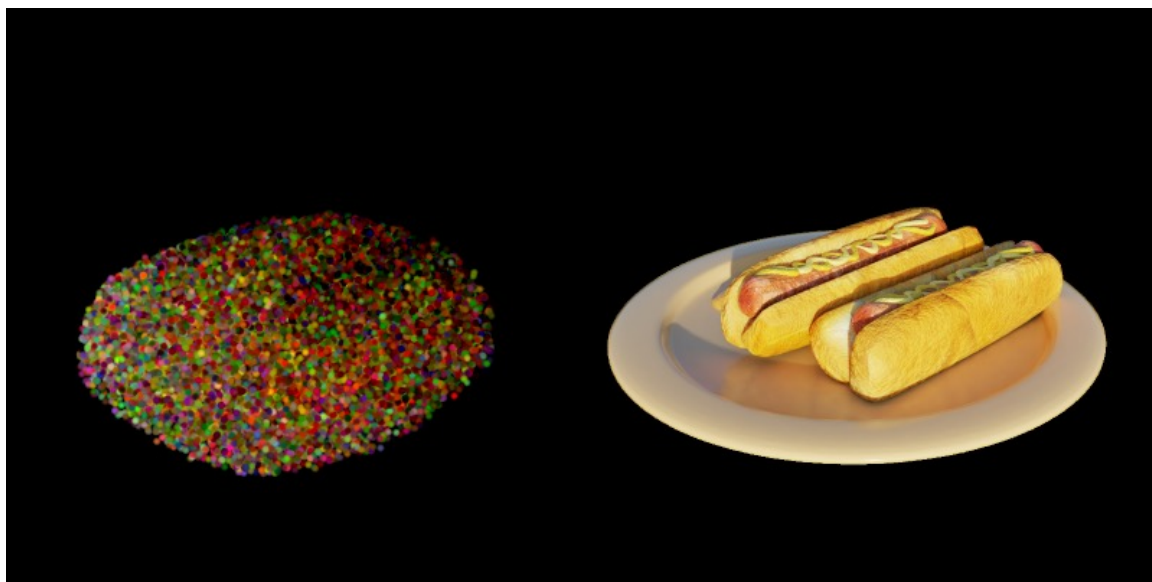
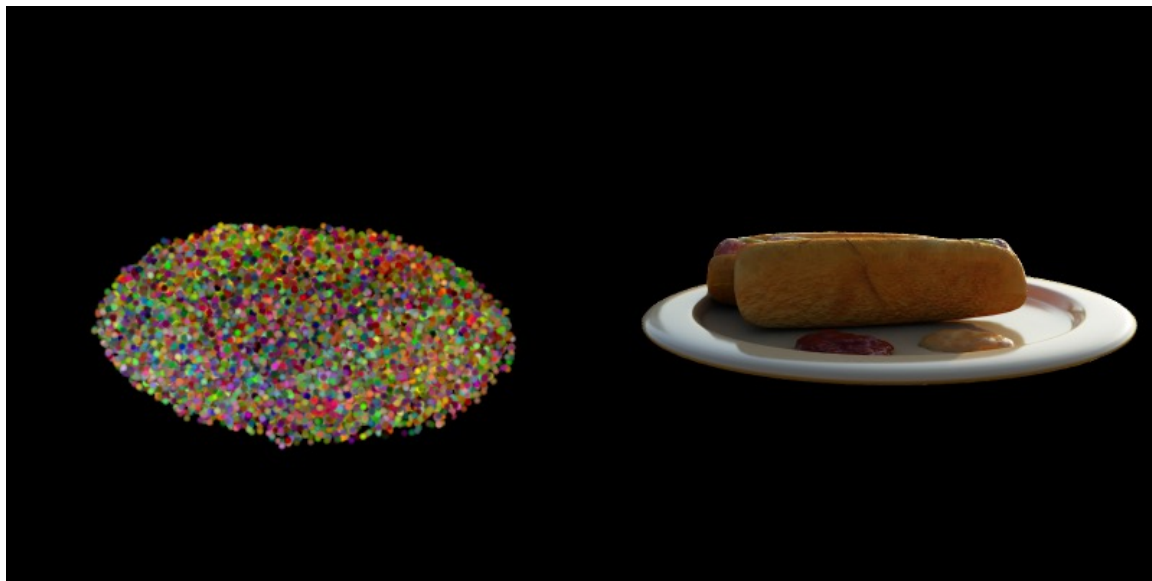


12% Corruption: quality even worse, clear that masks are too restrictive

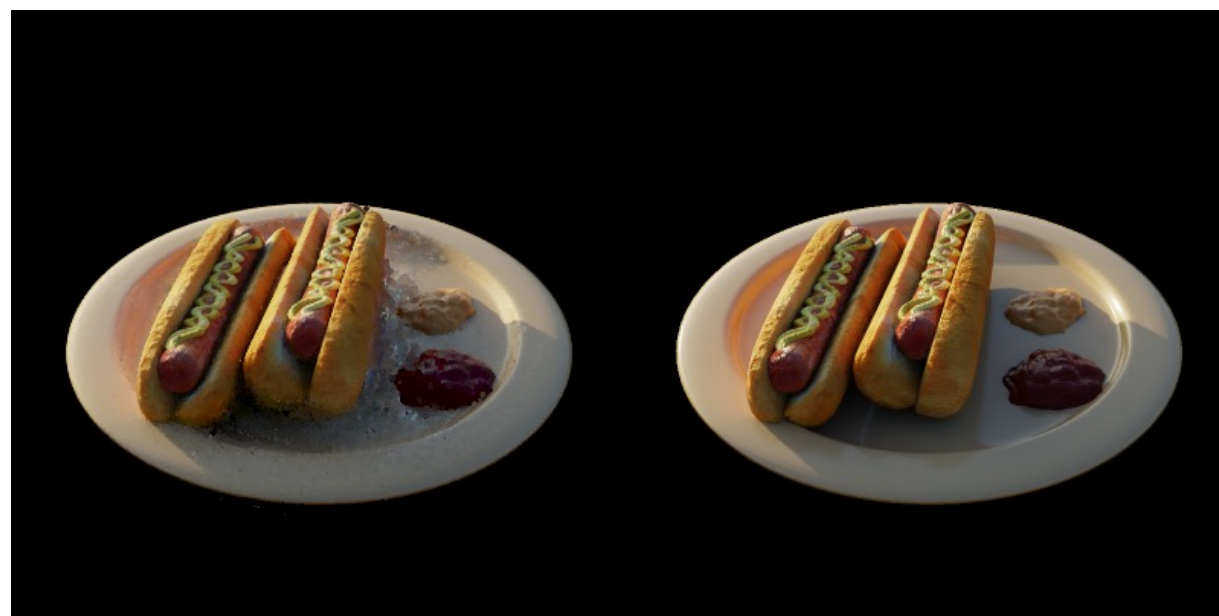
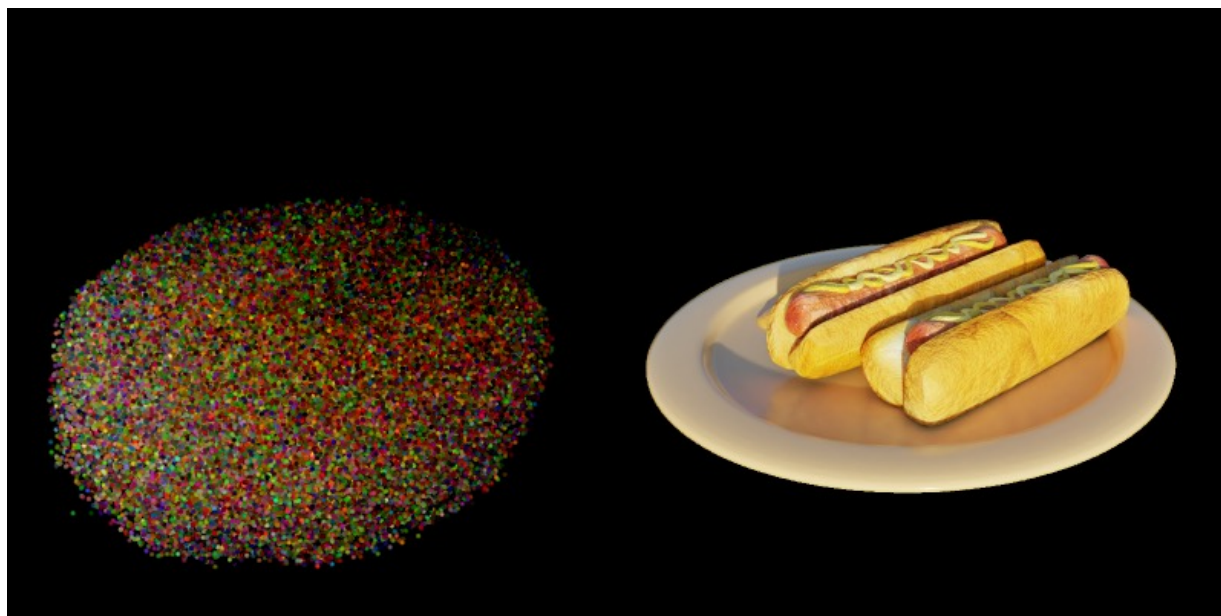
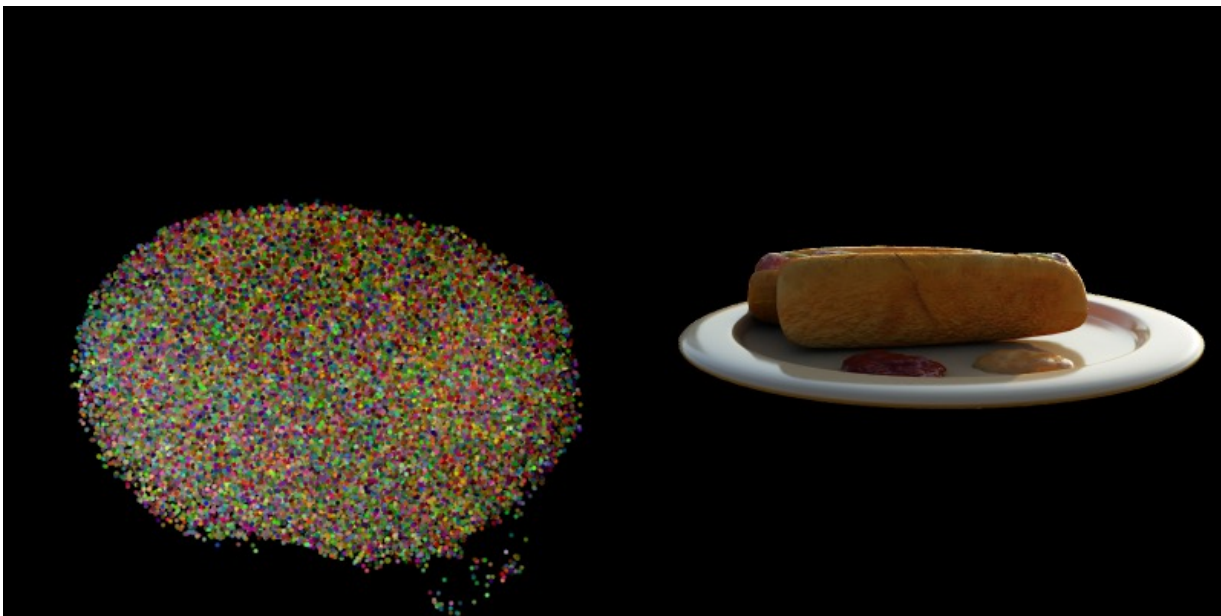


As corruption increases, render quality and model size decrease

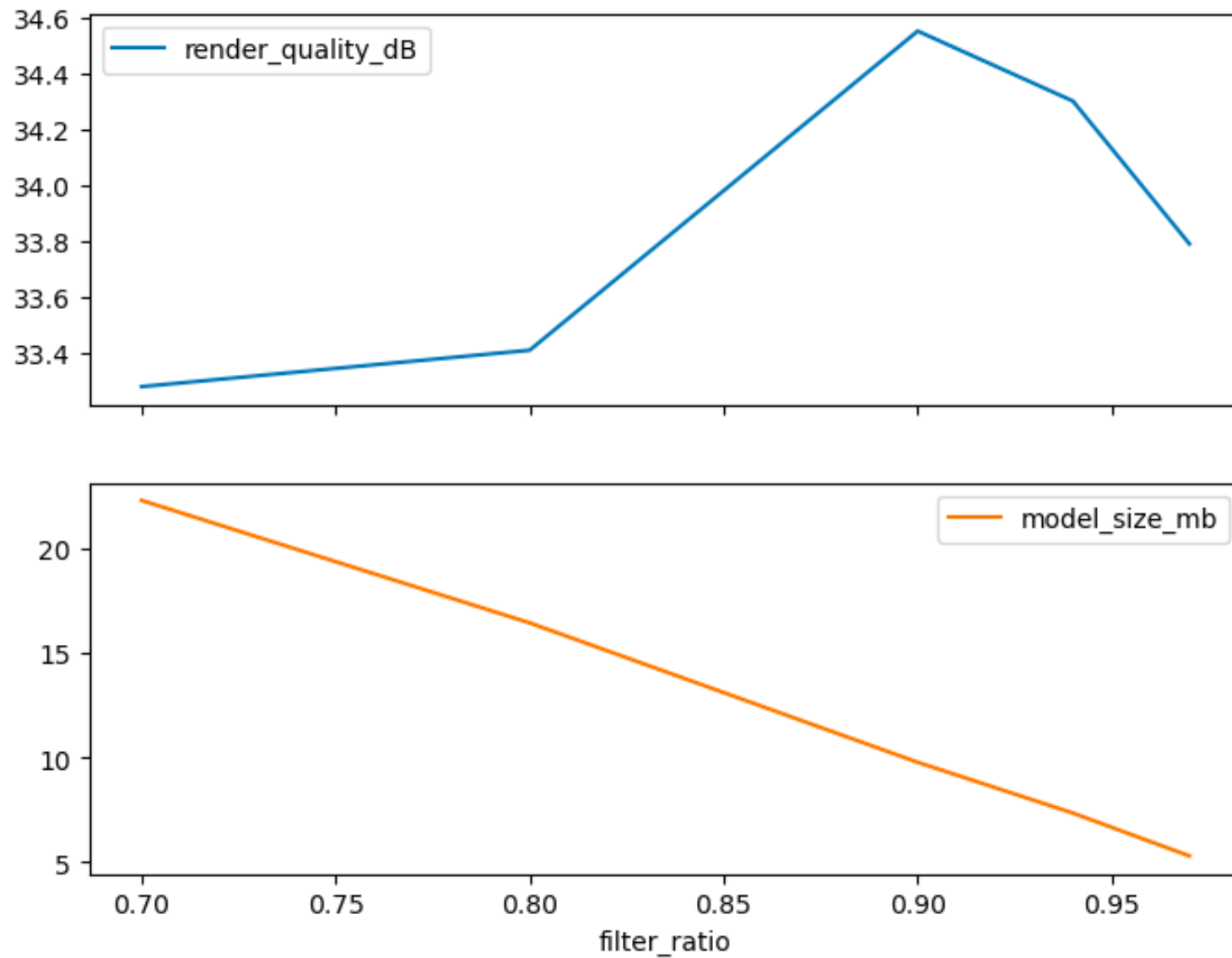
Solution



Fix corruption at 12%. Relax mask constraint 90%: point cloud is bigger, render quality improves

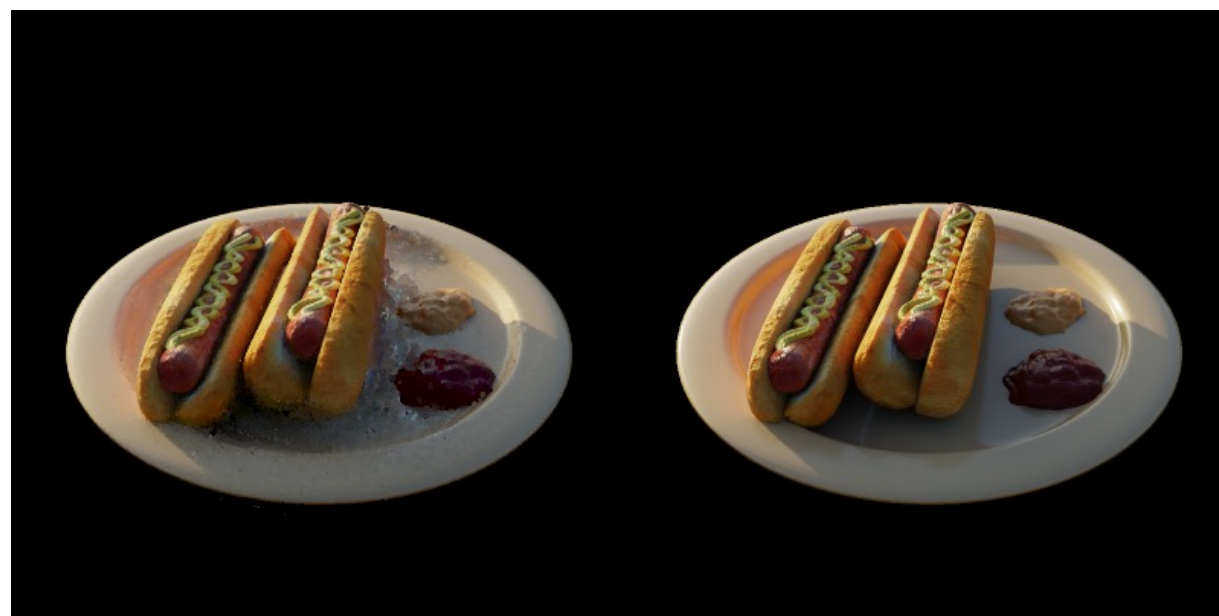
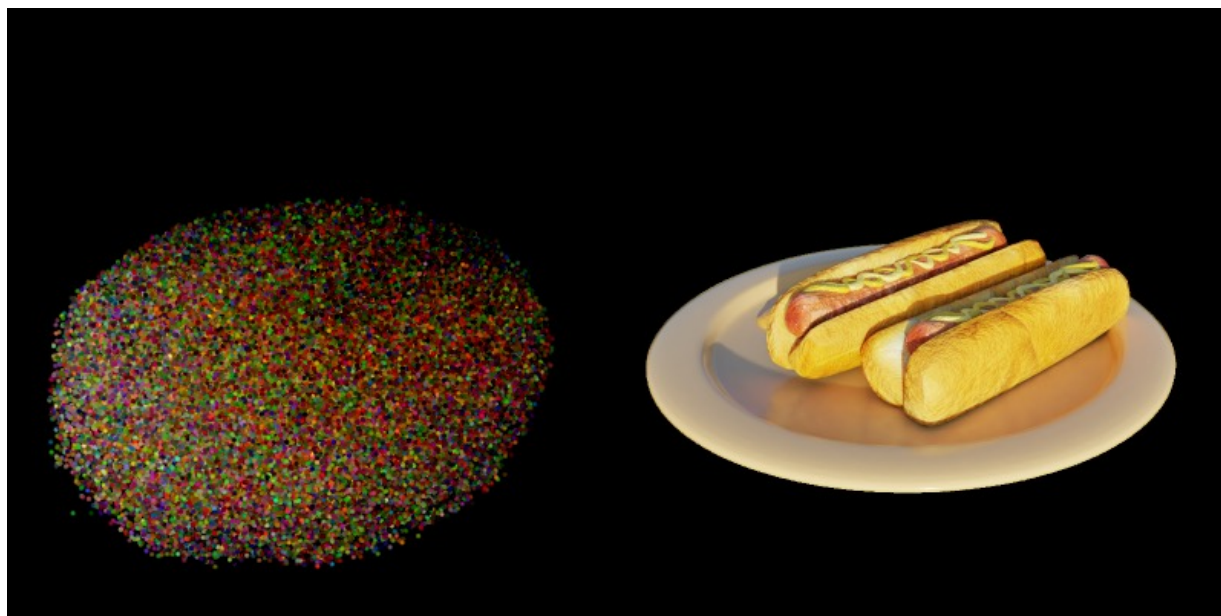
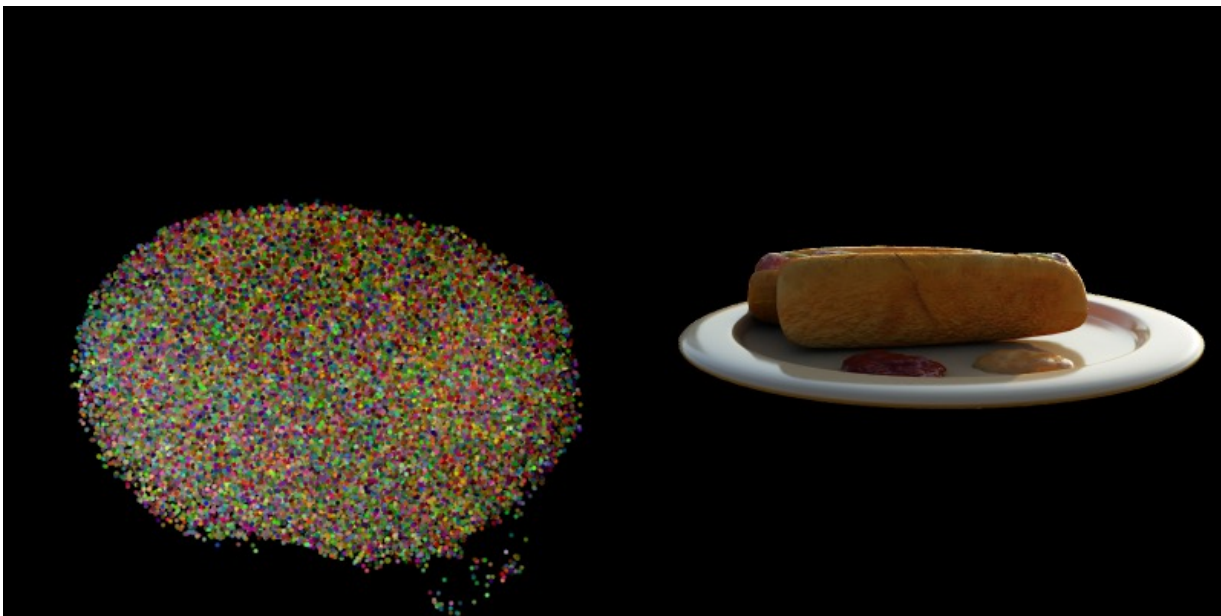


Fix corruption at 12%. Relax mask constraint 70%: point cloud initialization kind of bad, render quality decreases



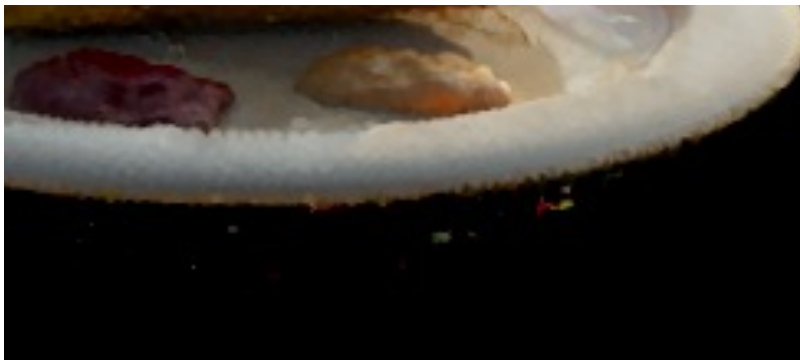
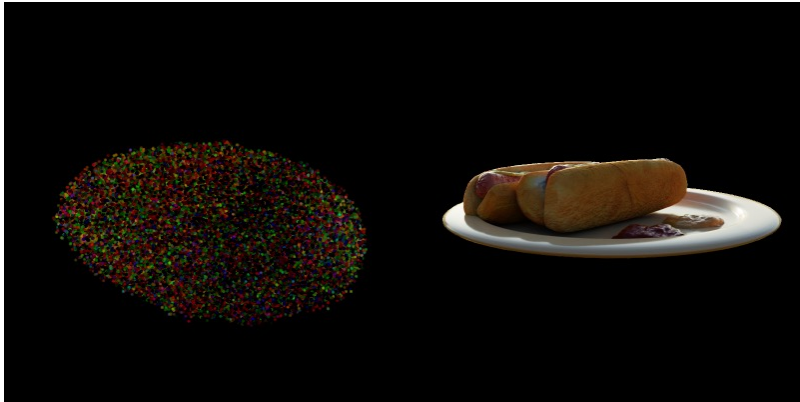
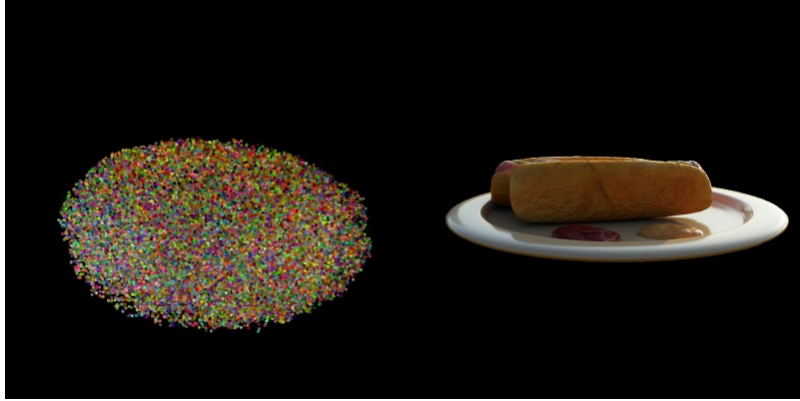
Fixed 12% corruption. Relaxing mask constraint improves render quality until it doesn't. Annoying to tune

Issues with this solution




If constraint too relaxed, presence of outlier points and not inaccurate initialization

Corruption 12%, Mask constraint 70%:

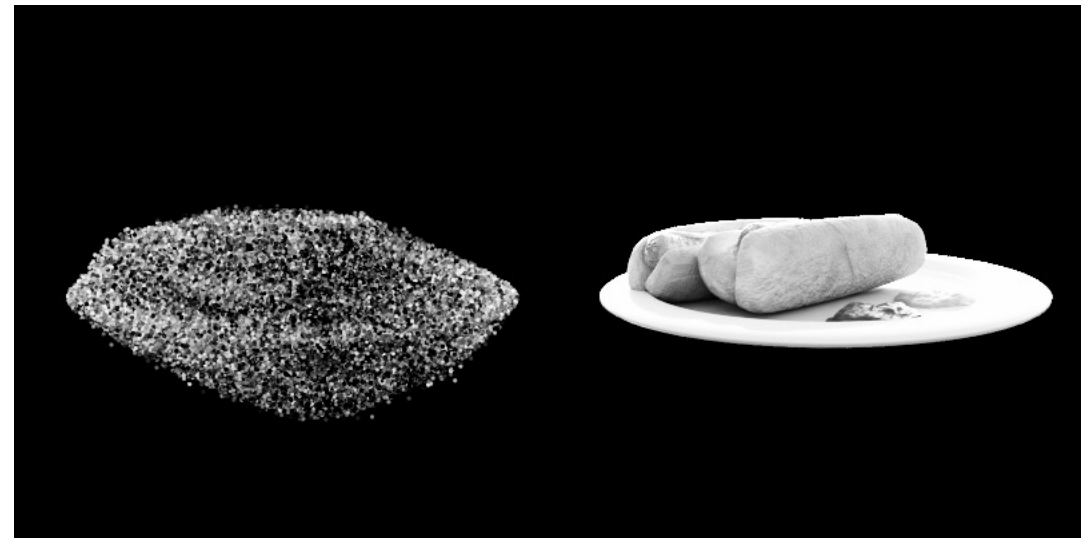
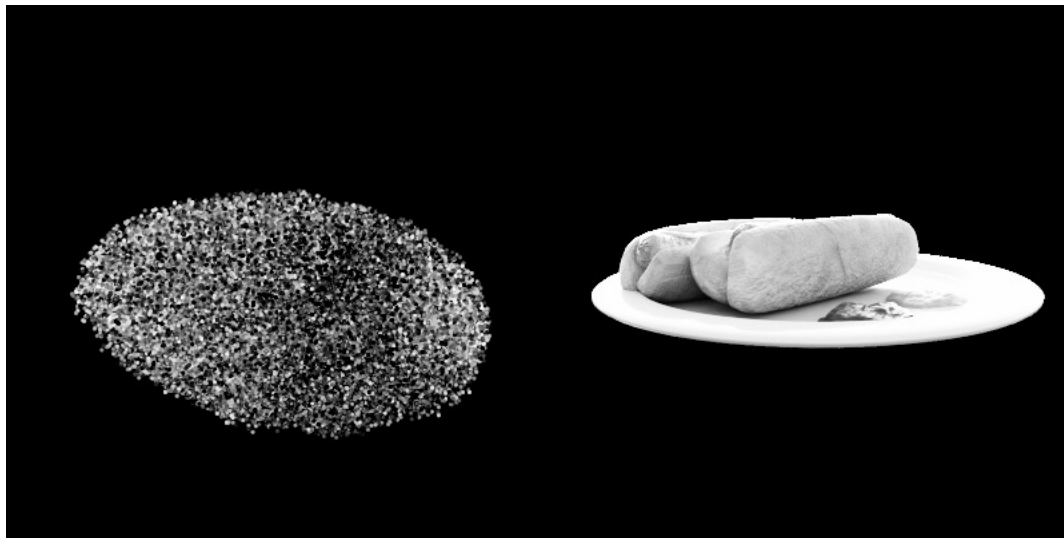
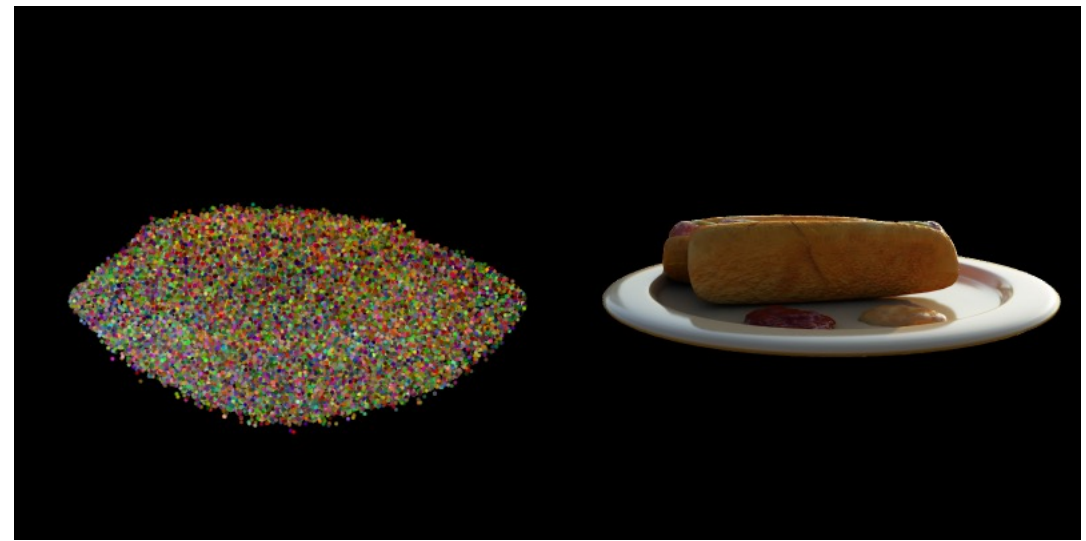
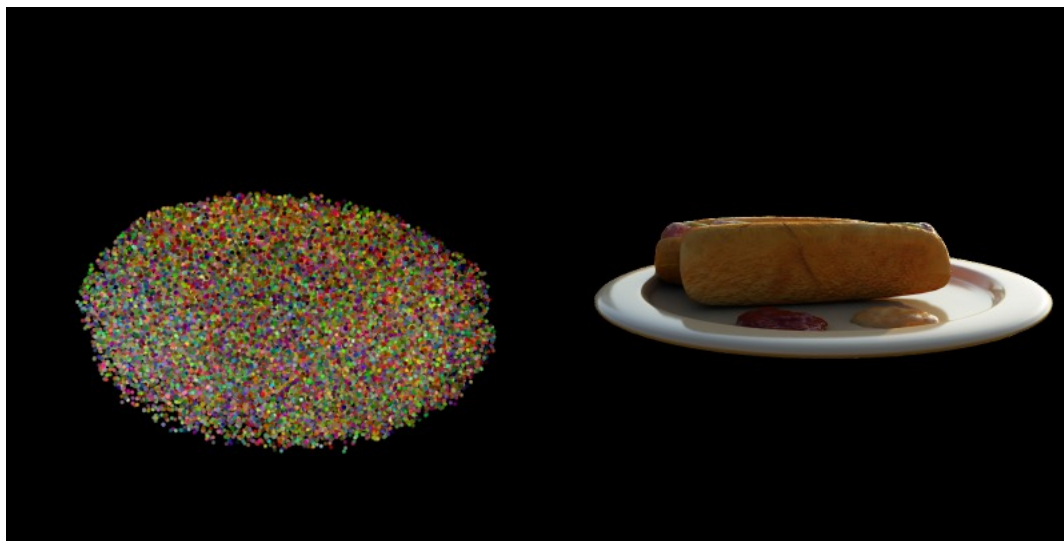


Poorly initialized points are being blacked out instead moved around (ie position change) -> may be the cause of artifacts

Corrupt 12%, Filter 80%, 5 epochs into training

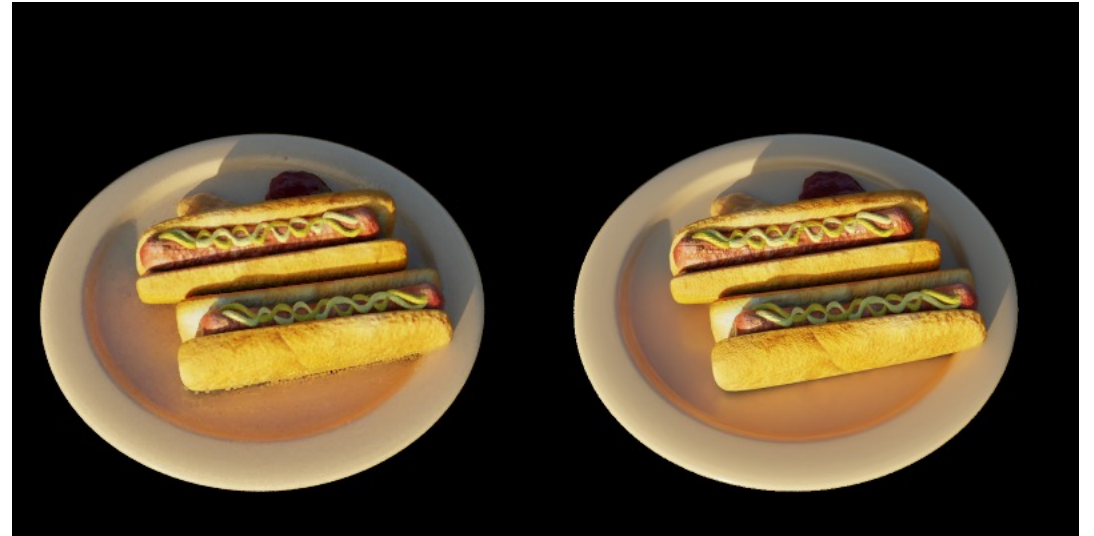
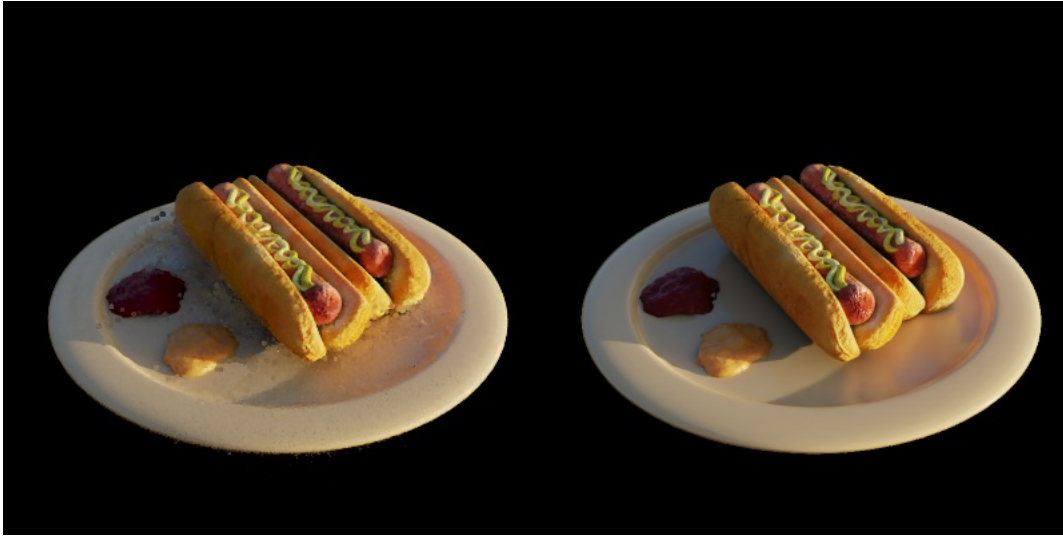


Solution, v2: relax mask +
pretraining step



Proposed solution: a few epochs of training, only on the position + regularize (shrinkage towards to center)

Corrupt12%, filter 80%,



rendering quality 33.41 -> 34.12 dB, model size: 16.44 -> 16.08 MB, qualitatively better
12% corruption, 80% masks, + pre training



More examples of small improvements

12% corruption, 80% masks, + pre training:

Summary

- Point Radiance Fields: fast alternative to NERF
 - But relies on masks
- In real world, masks are imperfect:
 - Showed empirically the degraded performance.
- Solution to this problem: relax mask constraint
 - Showed naïve version works but has new issues
 - Inaccurate initialization -> hard to optimize, artifacts
 - Proposed a potential fix
 - Pretraining + regularization