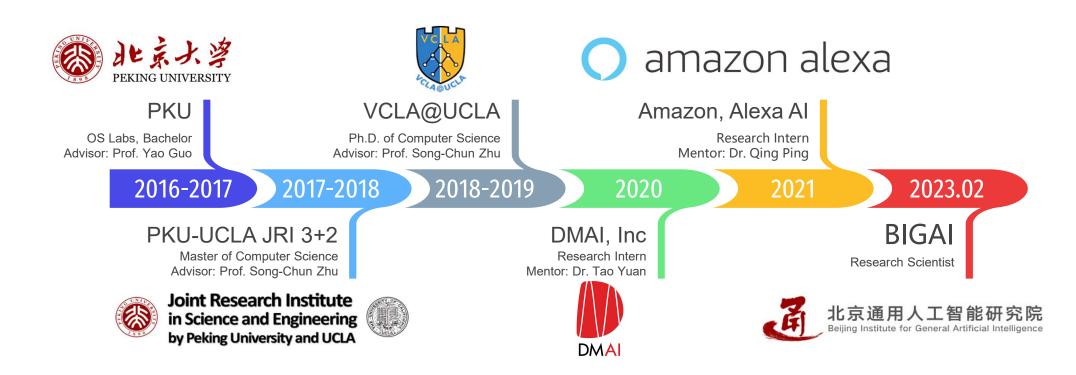




Building Interactable 3D Scenes for Embodied Al

Baoxiong Jia General Vision Lab, BIGAI

About me





What we (I) expected ©











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Embodied Al

"The embodiment hypothesis is the idea that <u>intelligence emerges in the interaction</u> of an agent with an environment and as a result of sensorimotor activity"

Smith & Gasser, The Development of Embodied Cognition: Six Lessons from Babies, 2005

Manipulation & Locomotion

RL / Imitation learning / MPC on specific scenes or skills

Interaction with scenes in daily life

Various object attributes and diverse scene configurations

Long-horizon interaction with scenes

Walk, Run, Crawl, RL Fun | Boston Dynamics | Atlas, 2025 https://www.youtube.com/watch?v=I44_zbEwz_w Damen et al., Scaling Egocentric Vision: The Epic-Kitchens Dataset, 2018

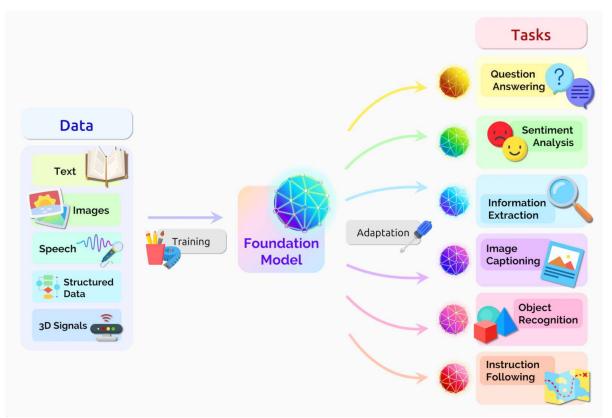


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What we learned previously

Data Data Data !!!

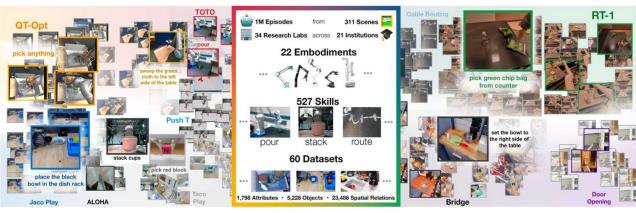
- ImageNet → Image Understanding
 - Million scale images
- GPT → Language modeling
 - Billion scale texts
- CLIP → Multi-modal alignment
 - Billion scale image-text pairs
- GPT-4V → More modalities
 - Unknown huge size (?)



NVIDIA, What are foundation models, 2023 https://blogs.nvidia.com/blog/what-are-foundation-models/



Data for robotics?





Open-X-Embodiment (O'Neill et al., 2024)

Bridge Data V2 (Walke et al., 2023)



AgiBot World Colosseo (AgiBot, 2025)

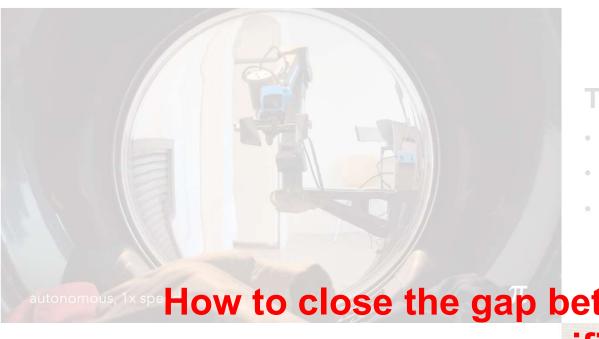


Droid (Khazatsky et al., 2024)

通识

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Training Generalist Policies

- Leveraging large-scale pre-trained VLMs
- Starting to show generalizability on complex daily life tasks

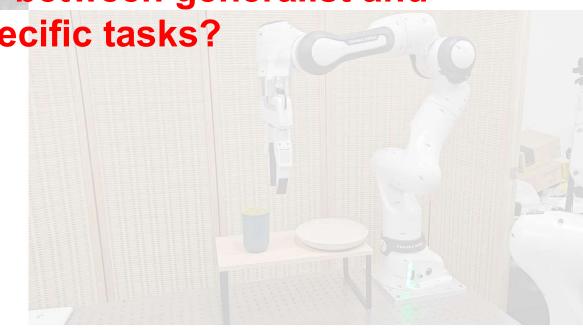
How to close the gap between generalist and

scene specific tasks?

Adapting to Your Specific Scene

- Can only afford few-shot demonstrations
- Sensitive to capturing modalities and viewpoints
- Rolling out "almost" successful trajectories but





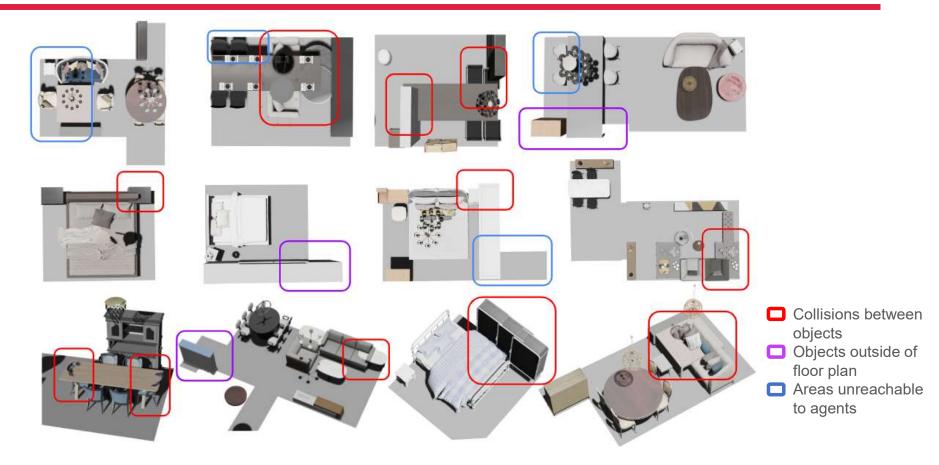
Scalable Generation of Synthetic Scenes

PhyScene: Physically Interactable 3D Scene Synthesis for Embodied Al CVPR 2024



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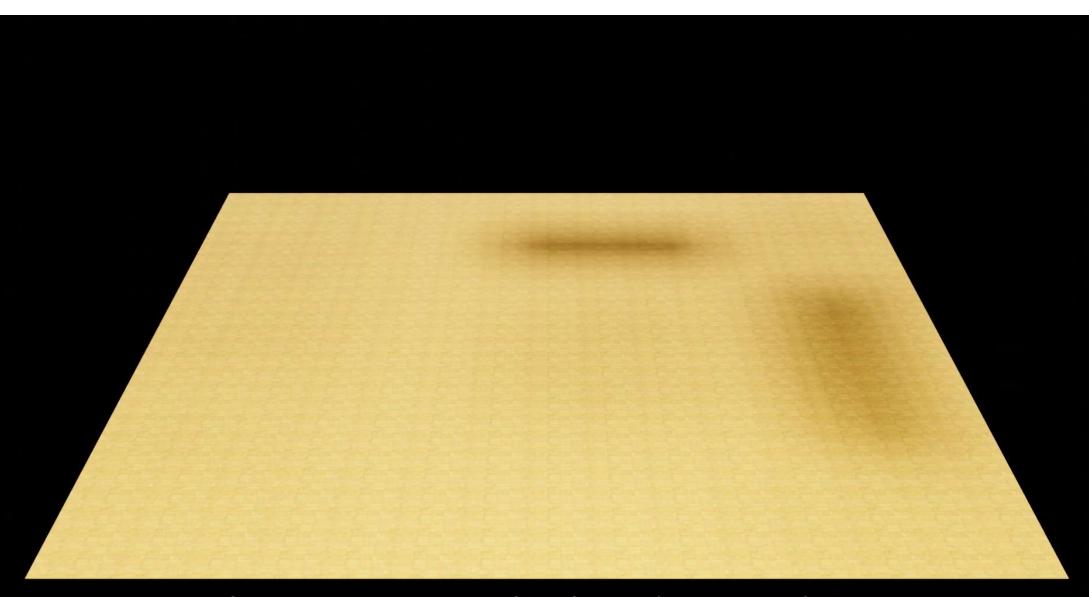
Synthetic Scenes to the Rescue?





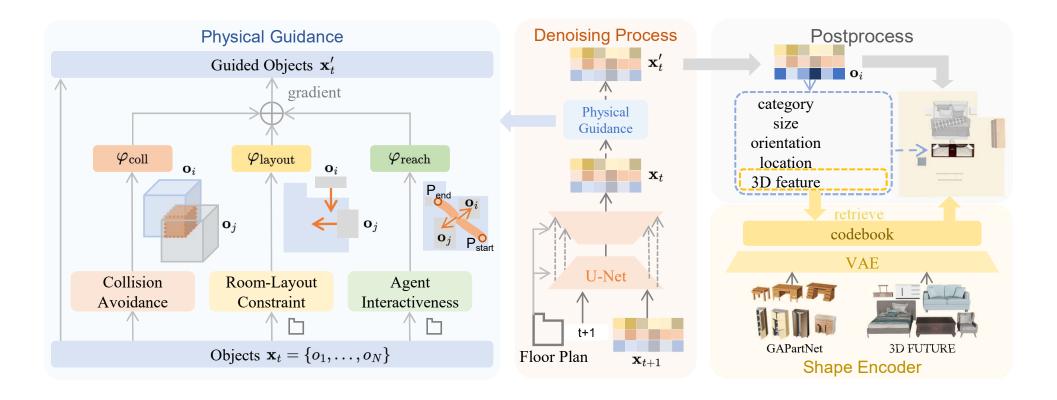


April 11, 2025



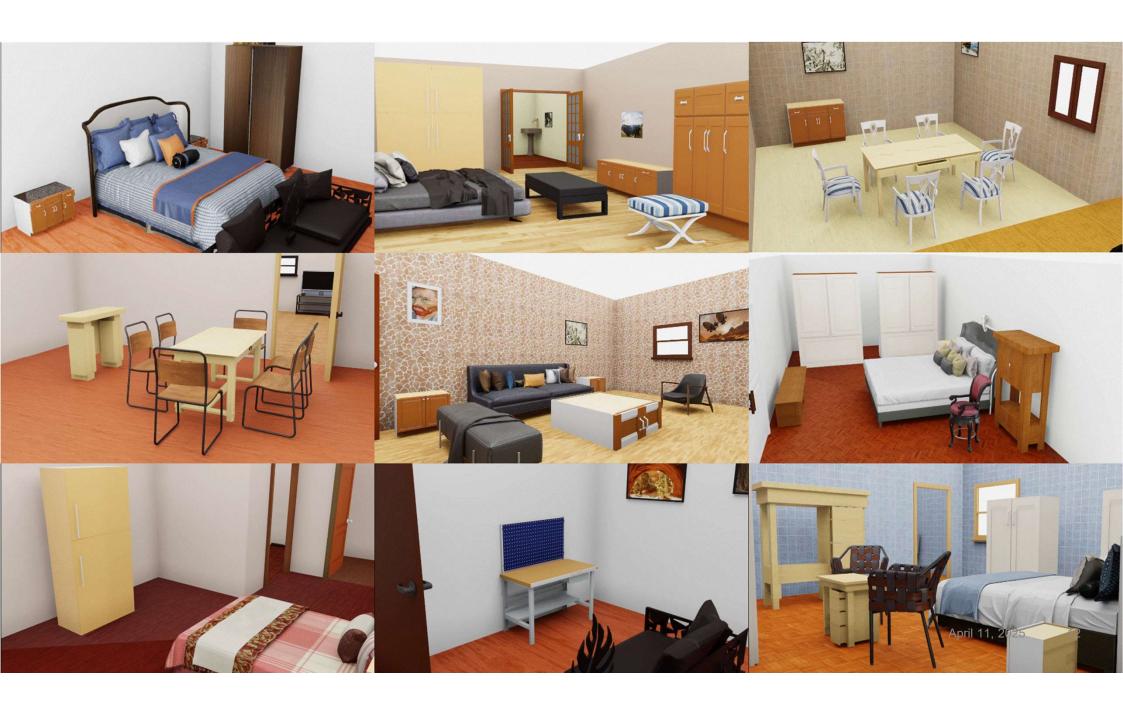
Yang et al., PhyScene: Physically Interactable 3D Scene Synthesis for Embodied AI, CVPR 2024 (Highlight)

PhyScene





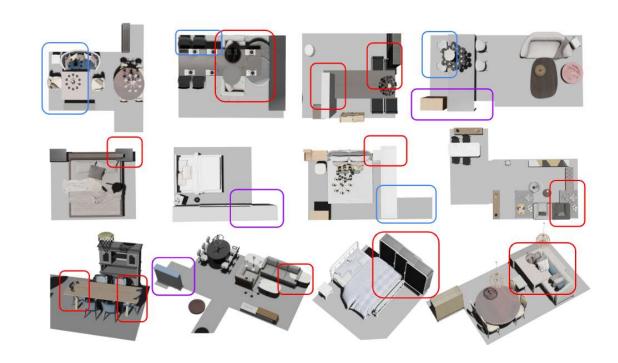
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Limitations

Not enough scale / diversity

- No small objects
- Limited articulated objects
- Three room types available
- Limited scale (thousands)



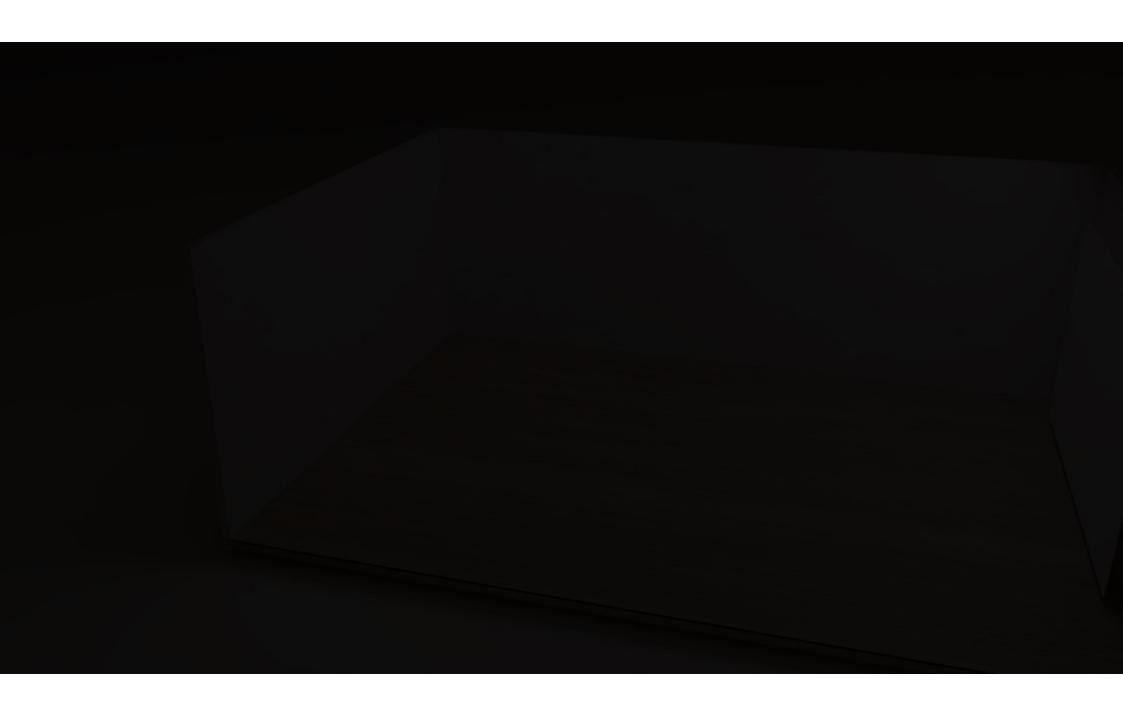


Bringing Real Scenes into Simulation

MetaScenes: Towards Automated Replica Creation for Real-world 3D Scans CVPR 2025



General Vision Lab, BIGAI April 11, 2025



MetaScenes creation



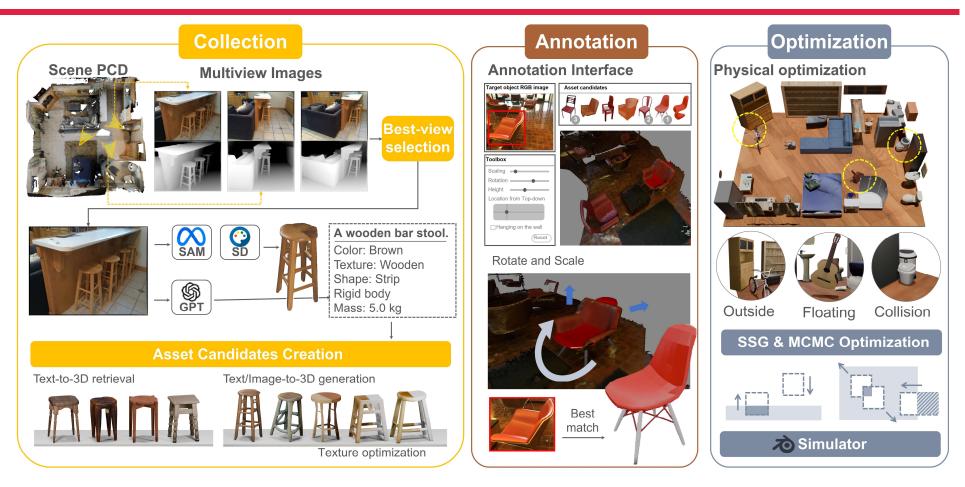


MetaScenes creation





MetaScenes creation





MetaScenes for EAI



Scan scene

Replica scene









Table 5. Cross-domain embodied navigation. METASCENES improves generalization in unseen real scenes.

Benchmark	Data Source	SR(%)↑	EL↓	Curvature↓	SEL↑	SPL↑
In-domain Scenes	ProcTHOR [13] METASCENES Both	52.43 58.00 59.07	25.34 23.40 22.78	0.38 0.17 0.21	50.00 55.00 55.94	43.81 51.39 52.28
Heldout Scenes	ProcTHOR [13] METASCENES Both	51.21 52.64 51.36	25.73 25.57 25.58	0.33 0.14 0.22	48.43 49.62 48.33	43.82 45.55 44.78
Heldout Domains	ProcTHOR [13] METASCENES Both	45.33 50.67 46.67	28.56 26.56 26.95	0.38 0.25 0.27	42.90 47.78 43.43	37.58 44.33 41.51

Table A4. Comparison on VLN experiments with HSSD

Benchmark	Data Source	SR(%)↑	EL↓	Curvature↓	SEL↑	SPL↑
10 scenes from	HSSD	27.00	33.77	0.39	26.77	23.32
Replica CAD	METASCENES	32.00	33.71	0.46	31.56	26.91

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Discussion

Physical Plausibility

- Reconstructed / Generated objects
- Precise locations and physics
- Require additional manual post-optimization

Interactability

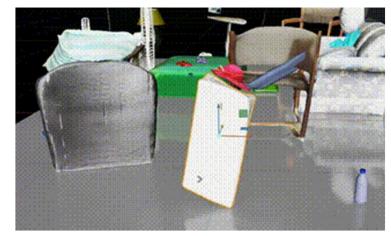
- Missing articulated objects
- Largely depending on available asset libraries
- Currently only for navigation, and potentially for pick & place





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Reconstruction of Interactable Objects

Building Interactable Replicas of Complex Articulated Objects via Gaussian Splatting ICLR 2025



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Articulated objects















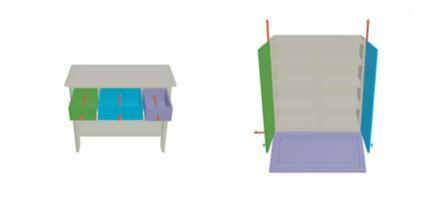




Articulated object reconstruction









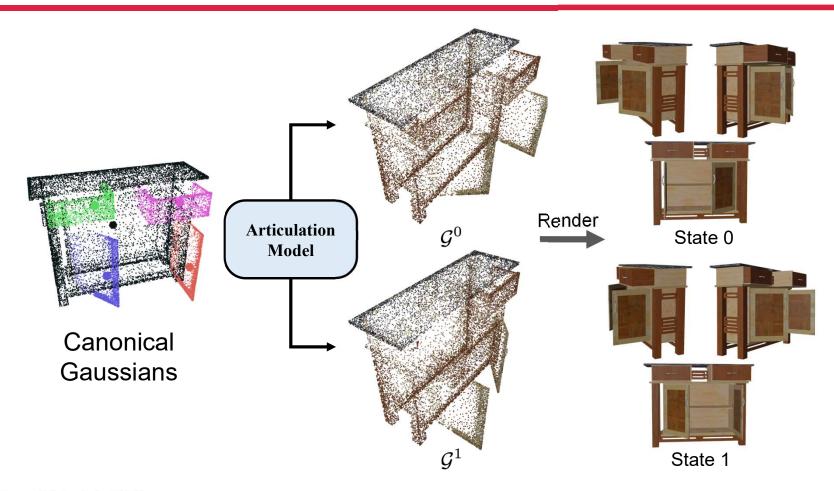








Problem formulation

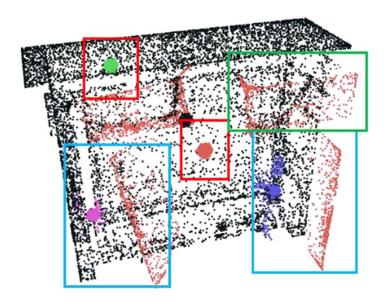


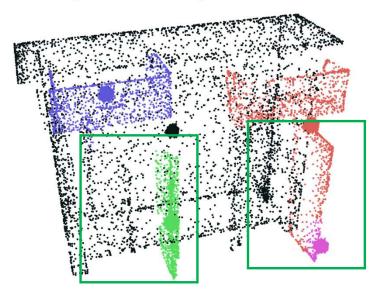


Key challenges

Simultaneous optimization of many correlating variables via rendering

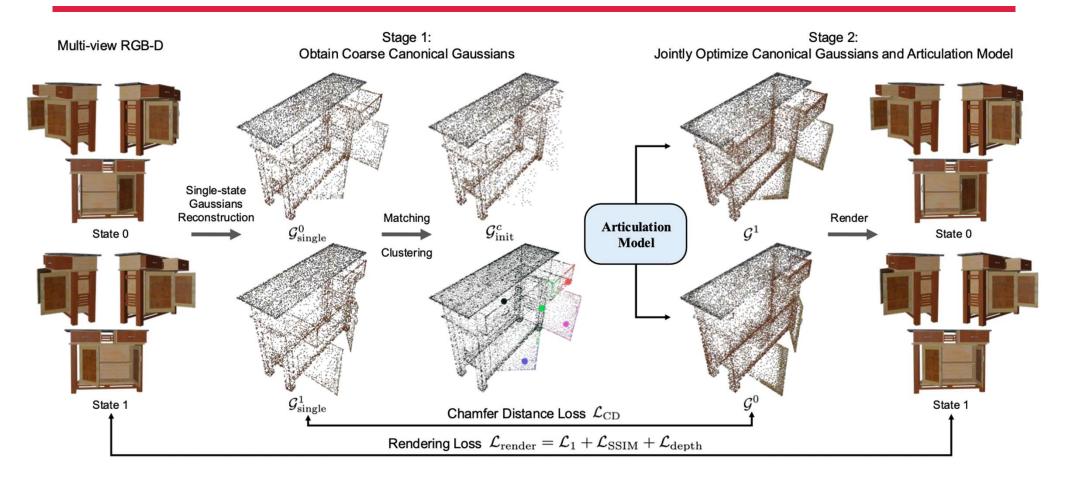
- Canonical Gaussians (base geometry)
- Object part identification (part movement identification)
- Dynamics modeling over Gaussians (articulation parameters)





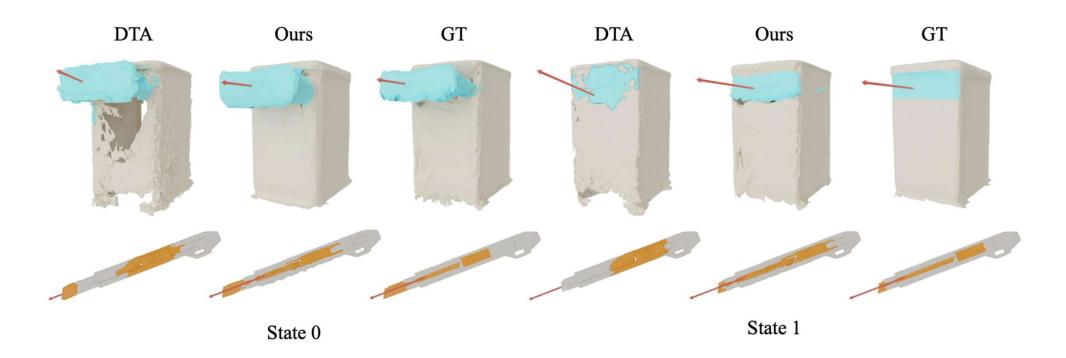


ArtGS



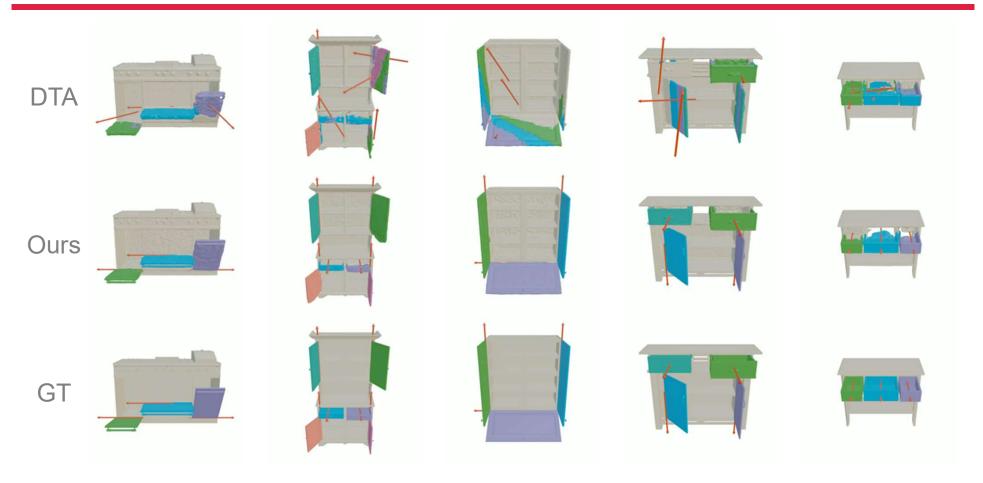


Results





Results





ArtGS: Building Interactable Replicas of Complex Articulated Objects via Gaussian Splatting

Discussion

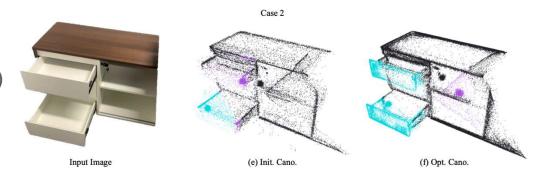
Problem Setting

- The two-state setting causes confusion
- Initialization is key to success
- Requires high-quality recording of objects

Input Image (a) Init. Cano. (b) M – Init. Cano. (c) Opt. Cano. (d) M – Opt. Cano.

Future?

- From static captures to videos
- Leveraging pre-trained models (e.g. SAM)
- Feed-forward reconstruction without perobject optimization





Physical Plausible Scene Reconstruction

Decompositional Neural Scene Reconstruction with Generative Diffusion Prior CVPR 2025

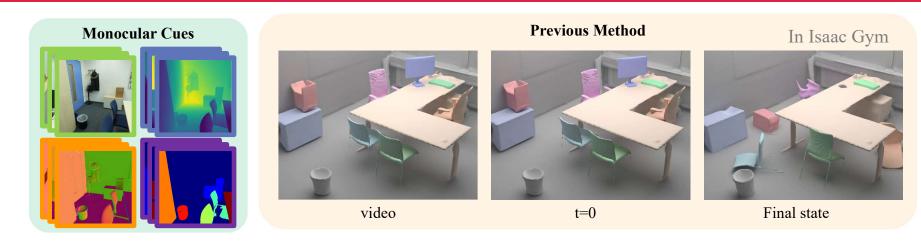
PhyRecon: Physically Plausible Neural Scene Reconstruction

NeurIPS 2024



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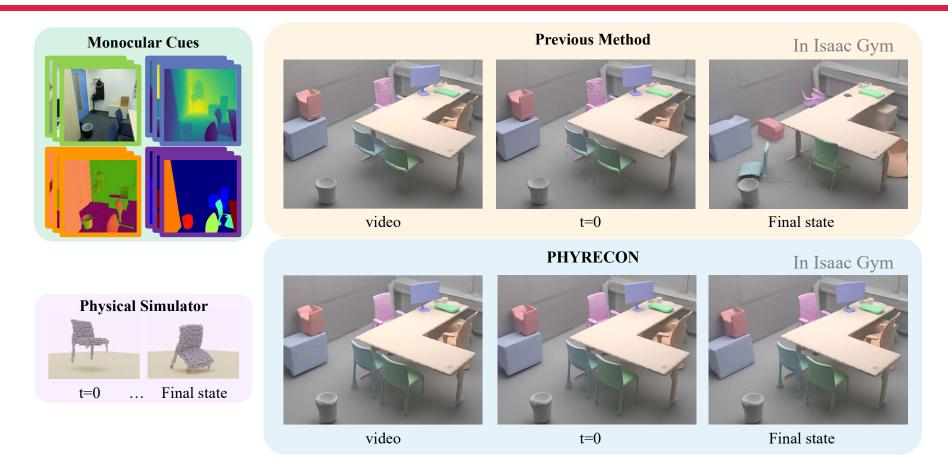
Physically plausible scene reconstruction



AG

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Physically plausible scene reconstruction

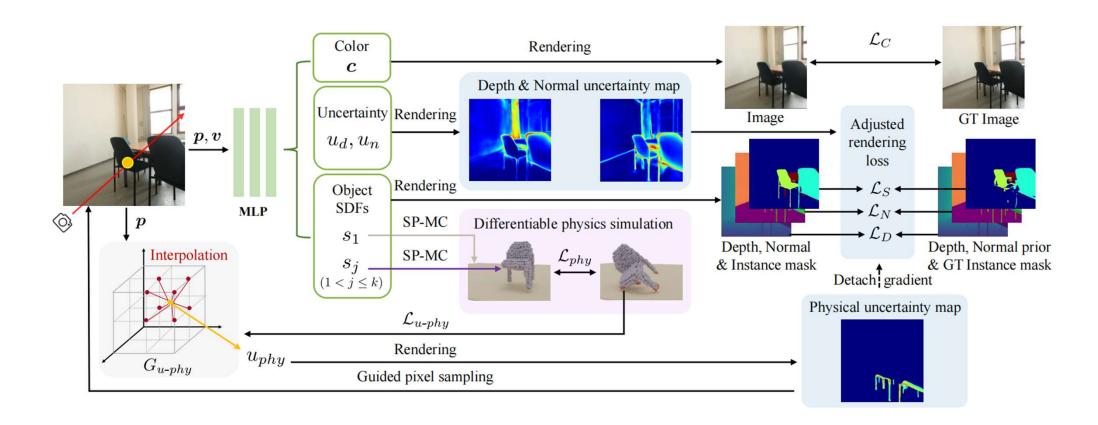






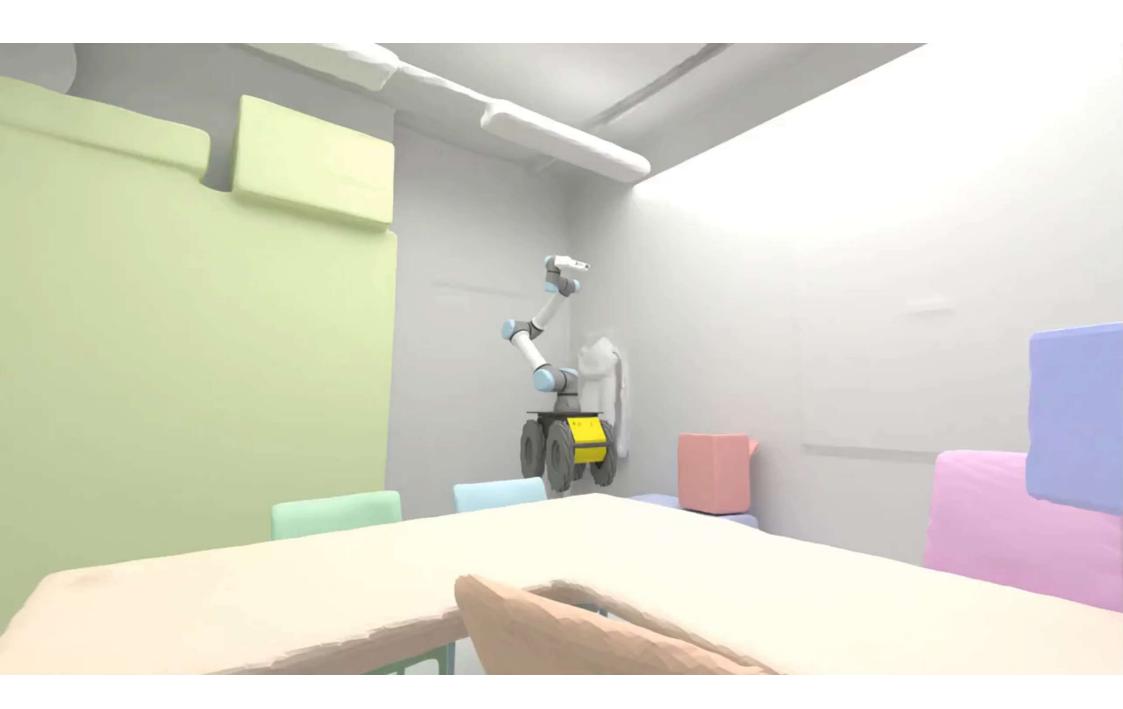
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PhyRecon





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Enough?

• In regions scarcely observed in the input image, objects tend to grow protrusions under the influence of physical loss, maintaining stability but distorting the shape.







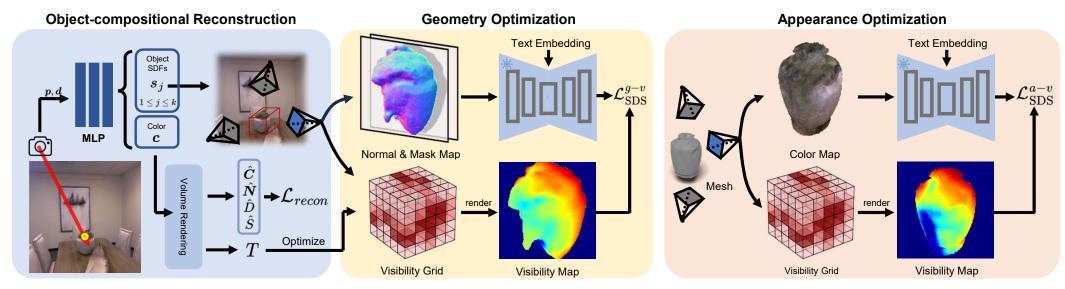
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Image View New View

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Leveraging diffusion prior

- Object-compositional Reconstruction: Optimize the SDF for each object in the scene.
- Geometry Optimization: Incorporate a text-guided geometry prior.
- Appearance Optimization: Incorporate a text-guided appearance prior.





Ni et al., Decompositional Neural Scene Reconstruction with Generative Diffusion Prior, CVPR 2025

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DP-Recon for game (Replica by 10-views)

Interaction with Scenes



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Overall

From the Real2Sim perspective

- Asset substitution with physical optimization can give pretty good static scenes
- Reconstruction of scenes and interactable objects are starting to work
- EAI tasks like vision-language navigation can already be tested on these scenes
- Need more efficient and high-quality scene/object reconstructions for manipulation

. . .



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More to come from BIGAL





https://physcene.github.io/





https://meta-scenes.github.io





https://dp-recon.github.io







https://articulate-gs.github.io

Thank you!



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