



End-to-End Fine-Tuning of 3D Texture Generation using Differentiable Rewards

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Objective

Integrate task-specific preferences, encoded as differentiable rewards, into an end-to-end learning framework to generate texture images aligned with the geometry of a 3D mesh.

Advantages Our Method Offers

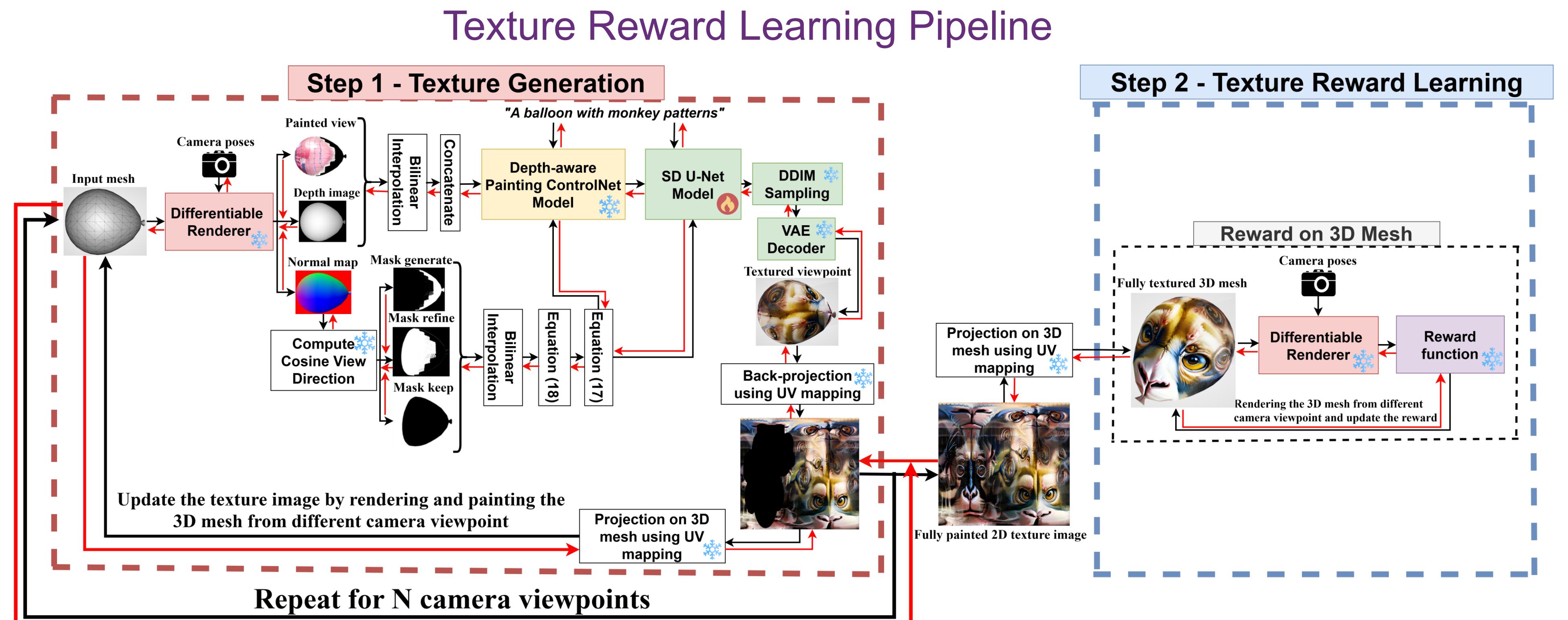
- Efficient optimization:** Removes costly sampling-based reinforcement learning, reducing computation time.
- End-to-end geometry awareness:** Backpropagates through the full 3D generative process, aligning textures naturally with mesh geometry.

Core Idea: Align Texture with Geometry

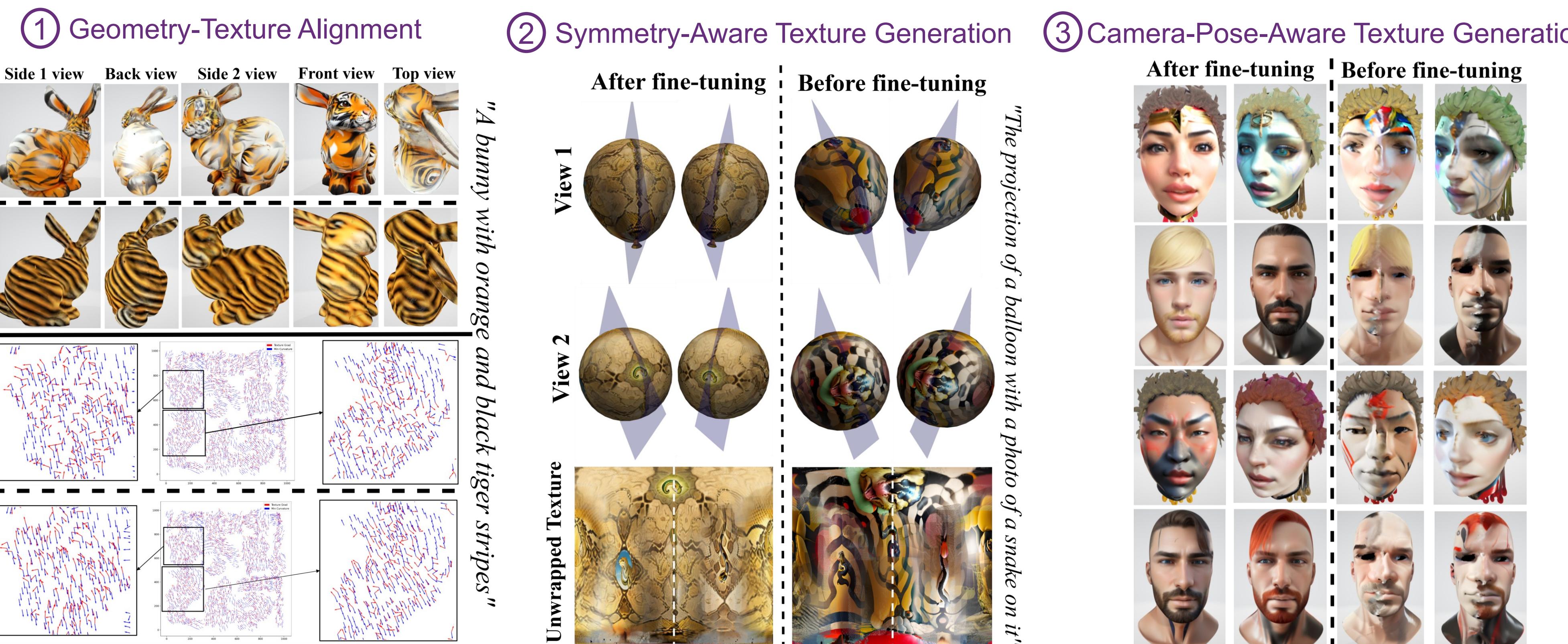
- Texture Generation (TexGen):** Render a 3D mesh from multiple viewpoints (V_{gen}) and apply a 2D text-to-image diffusion model (θ) to generate its texture from a text (c) sampled from a dataset (p_c).
- Reward Design:** Compute alignment between texture features and 3D surface geometry through a differentiable reward (r).
- Reward Learning:** Given the TexGen texture, maximize the following objective:

$$J(\theta) = \mathbb{E}_{c \sim p_c} [r(\text{TexGen}(\theta, c, V_{gen}), c)]$$

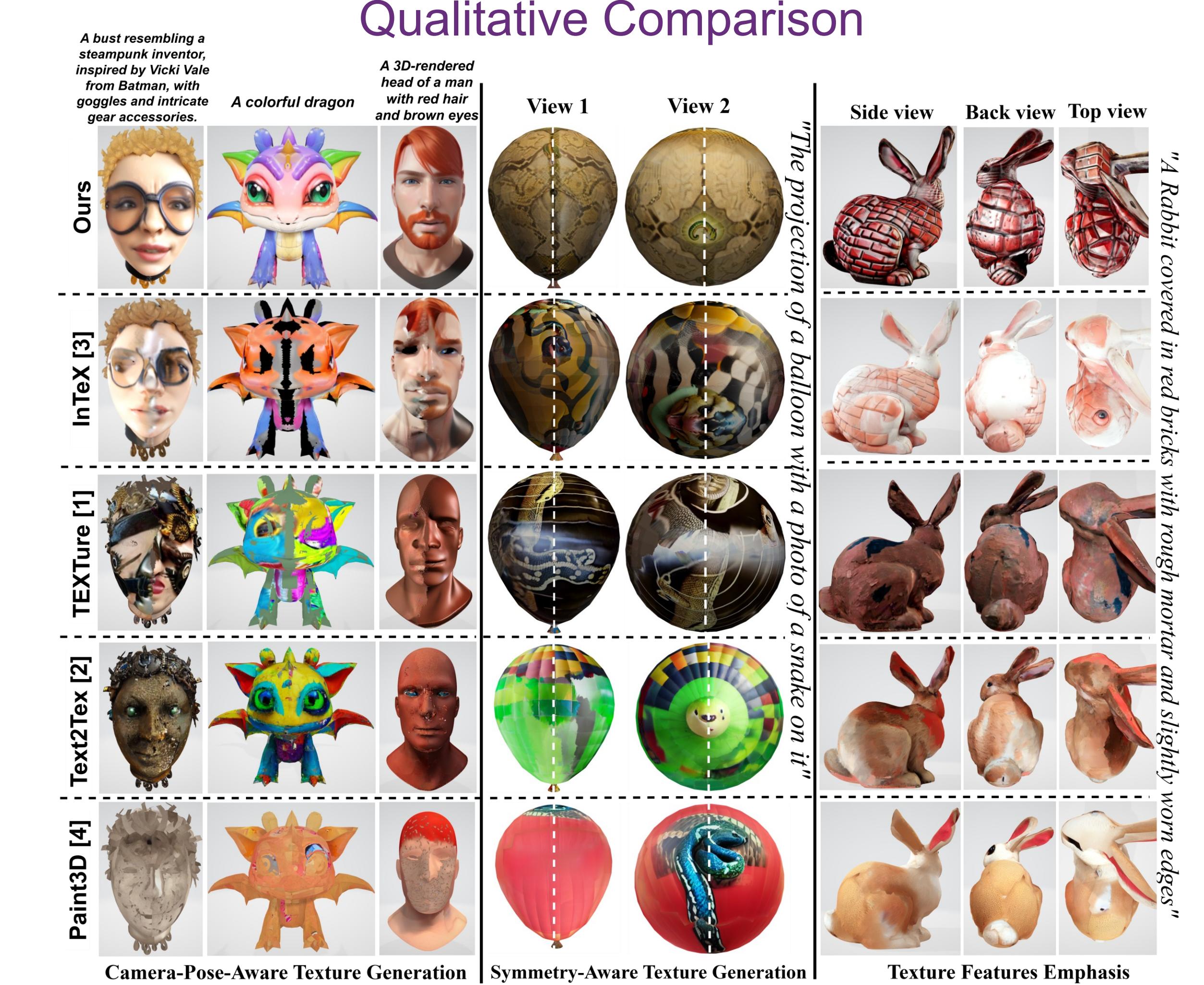
Systematic Approach to The Texture Preference Learning Problem



Geometry-Aware Reward Design



Comparative Texture Generation Results



Quantitative Comparison

Method	Aesthetic ↑	ImageReward ↑	HPSv2 ↑	PickScore ↑	CLIPScore ↑	Inference Time (sec)
TEXTure [1]	4.3910 ± 0.0328	-1.2245 ± 0.1199	0.1728 ± 0.0031	20.0719 ± 0.1083	0.3142 ± 0.0051	150
Text2Tex [2]	4.4544 ± 0.0348	-1.5088 ± 0.0823	0.1769 ± 0.0052	19.6886 ± 0.1862	0.2900 ± 0.0054	450
InTex [3]	4.7467 ± 0.0381	-1.0859 ± 0.1469	0.1879 ± 0.0033	19.8832 ± 0.2368	0.3077 ± 0.0055	15
Paint3D [4]	4.7192 ± 0.0388	-1.6621 ± 0.0977	0.1549 ± 0.0089	18.8966 ± 0.2798	0.2798 ± 0.0065	30
Ours - Cam-Pose-Aware Reward	4.9328 ± 0.0271	-0.0479 ± 0.1748	0.2095 ± 0.0058	19.7609 ± 0.1573	0.3003 ± 0.0057	15
Ours - Geo-Tex-Align Reward	4.7722 ± 0.0324	-0.1758 ± 0.1136	0.2479 ± 0.0034	21.5022 ± 0.1293	0.3367 ± 0.0041	15
Ours - Sym-Aware Reward	4.9473 ± 0.0309	0.0663 ± 0.0901	0.2118 ± 0.0031	20.8361 ± 0.0444	0.3076 ± 0.0032	15
Ours - Tex-Emphasis Reward	5.0308 ± 0.0376	-0.5960 ± 0.1694	0.2534 ± 0.0027	20.8822 ± 0.1125	0.3158 ± 0.0028	15

References

- [1] Richardson, et al. "Texture: Text-Guided Texturing of 3D Shapes," ACM SIGGRAPH 2023.
- [2] Chen, et al. "Text2Tex: Text-Driven Texture Synthesis via Diffusion Models," ICCV 2023.
- [3] Tang, et al. "InTex: Interactive Text-to-Texture Synthesis via Unified Depth-Aware Inpainting," 2024.
- [4] Zeng, et al. "Paint3D: Paint Anything 3D with Lighting-Less Texture Diffusion Models," CVPR 2024.