The Scene Language: Representing Scenes with Programs, Words, and Embeddings

- Supplementary Material -

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A. Overview

This file contains representation details (Appendix B), experiment details (Appendix C), extended experiment results (Appendix D), discussions of limitations (Appendix E), and full language model prompts and outputs (Appendix F).

B. Representation Details

B.1. Domain-Specific Language

The complete DSL is listed in Tab. 5. We explain the four macros introduced in Sec. 3.2, also listed in Tab. 5, as follows.

- Macro call retrieves <entity-func> bound to the input word, applies the function on the input embeddings, and outputs a data object of type Entity. Specifically, (car embedding-list) is the embedding of the output entity corresponding to z from Eq. (2), and (cdr embedding-list) is the embeddings of its descendent entities corresponding to γ .
- Macro union composes transformed entities by aggregating inputs into a list.
- Macro union-loop applies union in a for loop.
- Macro transform pairs an entity with its pose.

B.2. Details of Graphics Renderers

This section expands the instantiation of three graphics renderers from Sec. 4 in detail. For each renderer, we will discuss its parameter space Θ and \mathcal{T} , rendering operation \mathcal{R} , and the reparameterization function g_{reparam} .

B.2.1. SDS-Based Renderer

Parameter Space with 3D Gaussians. For this renderer, Θ is the space of 3D Gaussian parameters and \mathcal{T} is the space of 3D affine transformation matrices. In particular, each primitive is parameterized as a set of K 3D Gaussians under a 3D affine transformation t, written as $(\theta,t)=(K,\{\phi_i\}_{i=1}^K,t)\in\Theta\times\mathcal{T}$, where ϕ_i is the set of parameters for a single 3D Gaussian, and t is a 3D transformation matrix. Each Gaussian parameter ϕ is defined as

 $\phi := (\mu, \alpha, s, q, c)$, denoting the 3D center position, opacity, scale, rotation in quaternion, and color of the Gaussian, respectively. An entity consisting of N primitives is parameterized as $\{(\theta_j, t_j)\}_{j=1}^N = \{(K_j, \{\phi_i^j\}_{i=1}^{K_j}, t_j)\}_{j=1}^N$.

Differentiable Rendering. The rendering operation \mathcal{R} for the 3D Gaussian renderer is as follows.

Following [18], a single Gaussian is defined by

$$G(x) = e^{-\frac{1}{2}(x-\mu)^T \Sigma^{-1}(x-\mu)},$$

where $x \in \mathbb{R}^3$ is a point in world coordinate, $\Sigma := (RS)(RS)^T$ the 3D covariance matrix, R the rotation matrix computed from q, and S the scaling matrix computed from s.

A Gaussian under transformation $t \in \mathcal{T}$ with $t(x) = R_t S_t x + p_t$, where R_t, S_t, p_t are the rotation, scaling, and translation components, respectively, is then computed with G_t satisfying the follows:

$$G_t(t(x)) = G(x).$$

We assume that diagonal entries of the scaling matrix S_t are all positive, and therefore t is invertible. Solving for the above equation gives

$$G_t(x) = e^{-\frac{1}{2}(x-\mu_t)^T \sum_t^{-1} (x-\mu_t)},$$

where $\mu_t = t(\mu)$ and $\Sigma_t = ((R_t R)(S_t S))((R_t R)(S_t S))^T$. Let $\tilde{t}(\phi)$ be the Gaussian after applying transformation t on ϕ . Then $\tilde{t}(\phi)$ has center μ_t , rotation $R_t R$, scale $S_t S$, and has α and c remaining unchanged as derived above.

The rendering operation \mathcal{R} to convert an entity consisting of N primitives, $\{(\theta_j,t_j)\}_{j=1}^N=\{(K_j,\{\phi_j^i\}_{i=1}^{K_j},t_j)\}_{j=1}^N$, to the image space simply amounts to rendering all post-transformation 3D Gaussians in the scene, $\{\tilde{t}_j(\theta_j)\}_j:=\{\tilde{t}_j(\phi_i)\}_{i,j}$, following the projection and blending process from [18].

Primitive Reparameterization via SDS Guidance. Recall that g_{reparam} aims to obtain 3D Gaussian primitive parameters for per-primitive conditional embeddings $\{z_j\}_{j=1}^N$ and

```
Data Types
Word
                           // Word specifying semantics
Embedding
                           // Embedding specifying an entity's attributes
Matrix
                         ::= \operatorname{Array} [\operatorname{Array} [\operatorname{Float}]] \quad // \operatorname{Transformation} \operatorname{in} \operatorname{GA}(3,\mathbb{R})
Entity
                        ::= Tuple[Tuple[Word, Embedding], List[Tuple[Entity, Matrix]]]
                        ::= {\tt Array[Float]} \quad // \ {\tt Vector in} \ \mathbb{R}^3
Vector
Grammar
                        ::= <bind-expr>*
<br/><bind-expr>
                             (bind <word> <entity-func>)
<entity-func>
                             (lambda (embedding::Embedding embedding-list::List[Embedding])
                                 <sub-entities>)
<sub-entities>
                        ::= (union <entity-transform>*)
                          | (union-loop <loop-count> (lambda (i::Integer) <entity-transform>))
<entitv-transform>
                        ::= (transform <entity> <matrix>)
<entity>
                        ::= (call <word> <embedding>*)
<word>
                             Word
                        ::
                             Embedding -> List[Embedding] -> Entity
<entity-func>
                        ::
<loop-count>
                        ::
                             Integer
<matrix>
                             Matrix
                        ::
<embedding>
                             Embedding
                        ::
<4D-entity-func>
                        ::= (lambda () <create-entity-list>)
                                                                     // Define a function that outputs a 4D scene
<create-entity-list> ::=
                             (list <entitv>*)
                                                  // Represent a 4D scene as a temporal list of entities
Macros
call
                        ::= (lambda (word . embedding-list) // Return an entity from the semantic class of word
                                 (cons (cons word (car embedding-list))
                                                                                 (cdr embedding-list))))
                                    ((retrieve word) (car embedding-list)
union
                        ::= list
                                    // Compose transformed entities
                                                                   // Compose transformed entities using a for loop
union-loop
                        ::= (lambda (loop-count loop-func)
                                 (union (map loop-func (iota loop-count))))
                             cons // Transform entity pose
transform
call
                             Word -> List[Embedding] -> Entity
                        ::
                             (Tuple[Entity, Matrix])* -> List[Tuple[Entity, Matrix]]
union
                        ::
union-loop
                             Int -> (Int -> Tuple[Entity, Matrix])
                                -> List[Tuple[Entity, Matrix]]]
                             Entity -> Matrix -> Tuple[Entity, Matrix]
transform
                        ::
                             Vector -> Matrix // Compute translation matrix
translate
                        ::
                                                                          // Compute rotation matrix
rotate
                        ::
                             Float -> Vector -> Vector -> Matrix
                             Vector -> Vector -> Matrix // Compute scaling matrix
scale
                        ::
                             Vector -> Vector -> Matrix // Compute reflection matrix
reflect
                        ::
                             Matrix -> Matrix -> Matrix // Matrix multiplication
                        ::
                             Entity -> Vector // Compute center of an entity's bounding box
compute-shape-center ::
                             Entity -> Vector // Compute minimum corner of an entity's bounding box
compute-shape-min
                        ::
                                                  // Compute maximum corner of an entity's bounding box
compute-shape-max
                        ::
                             Entity -> Vector
compute-shape-sizes
                        ::
                             Entity -> Vector
                                                  // Compute sizes of an entity's bounding box
Special Forms
(bind <word> <entity-func>) // Defines and binds an entity function
                       // Retrieves an entity function bound to word, or (lambda (_) (list)) if such function does not exist
```

Table 5. **The Domain-Specific Language.** The table contains the DSL specification used to define our representation. Built-in data types (e.g., Float), functions (e.g., car) and cdr), special forms (lambda), and conditionals (if) are omitted; (lambda) and conditionals (lambda) are omitted; (lambda) and (lambda) are omitted; (lambda) and (lambda) are omitted; (lambda) and (lambda) are omitted; (lambda) are omitted; (lambda) and (lambda) are omitted; (lambda) are omitted;

global condition $z_{\rm global}$, where $z_j = g_{\rm CLIP}(c_j)$ is explained in Sec. 4, and $z_{\rm global} = g_{\rm CLIP}(c_{\rm global})$ is computed from a global scene description in texts, $c_{\rm global}$. We now expand Sec. 4 to describe the optimization process of $g_{\rm reparam}$ in detail

We write the SDS objective originally proposed in [25] as follows:

$$\nabla_{\psi} \mathcal{L}_{\text{SDS}}(x = \mathcal{R}(\psi); z, \hat{\epsilon})$$

$$= \mathbb{E}_{\eta \sim \mathcal{U}(0,1), \epsilon \sim \mathcal{N}(0,I)} \left[w(\eta) (\hat{\epsilon}(\alpha_{\eta} x + \alpha_{\eta} \epsilon, z, \eta) - \epsilon) \frac{\partial x}{\partial \psi} \right],$$

where $\hat{\epsilon}$ is a pre-trained image denoising network, η is diffusion timestep, and $w(\cdot)$, α_{η} come from diffusion schedule.

$$\begin{split} & \text{For entity } \{(\theta_j, t_j)\}_{j=1}^N, \text{ let} \\ & \mathcal{L}(\{z_j\}_j, z_{\text{global}}, \{t_{\text{init},j}\}_j) \\ &:= & \mathcal{L}_{\text{SDS}}(\mathcal{R}(\{\tilde{t}_j(\theta_j)\}_j); z_{\text{global}}, \hat{\epsilon}_{\text{ControlNet}}) \\ & + \sum_j \mathcal{L}_{\text{SDS}}(\mathcal{R}(\theta_j); z_j, \hat{\epsilon}_{\text{MVDream}}) \\ & + \sum_j \mathcal{L}_{\text{reg}}(\theta_j, \text{StopGrad}(t_j)) + \sum_j \mathcal{L}_{\text{layout}}(\theta_j, t_{\text{init},j}), \end{split}$$

where \mathcal{L}_{reg} , \mathcal{L}_{layout} are regularization terms following the definition from [44] and StopGrad stops gradients from backpropagation. Here, \mathcal{L}_{reg} penalizes Gaussian ellipsoids that are too long, and \mathcal{L}_{layout} penalizes Gaussians that lie

outside the intial bounding box specified by $t_{\rm init}$. Finally, we have

$$g_{\text{reparam}} = \mathop{\arg\min}_{\{(\theta_j,t_j)\}_{j=1}^N} \mathcal{L}.$$

During optimization, if primitives j_1 and j_2 have the same condition and initial normalized bounding box scale, i.e., $(z_{j_1}=z_{j_2}) \wedge (\frac{S_{t_{j_1}}}{\|S_{t_{j_1}}\|_2}=\frac{S_{t_{j_2}}}{\|S_{t_{j_2}}\|_2})$, they are enforced to have the same parameters θ (but still distinct t_{j_1} and t_{j_2}), which greatly reduces the number of parameters in the solution space.

In practice, for certain scenes, LM outputs treat detailed object parts as primitives, *e.g.*, the hat rim and hat top from the first example in Fig. 11, and the backbone model for SDS guidance cannot effectively model such fine-grained parts. Therefore, we treat the hat as a primitive, whose pose is computed from the minimum bounding box containing both the hat rim and hat top, before carrying out the above optimization. This process effectively adapts the granularity of the computation graph, originally specified in LM inference outputs, to the graphics renderer being used, by assigning intermediate nodes from the original computation graph as the new leaf nodes.

B.2.2. Mitsuba Renderer

Parameter Space. For this renderer, Θ is the parameter space for three types of graphics primitives supported by Mitsuba: cube, sphere, and cylinder, as specified in the function header for primitive_call in Appendix F.1.1. \mathcal{T} is the 3D affine transformation space.

Renderer. We use the path tracer with maximum depth 8 implemented in Mitsuba. In this work, we use Mitsuba as a generic graphics engine and do not take advantage of its differentiability.

Reparameterization. Since we directly prompt LM to generate Mitsuba primitive parameters in its outputs as specified in Appendix F.1.1, the function parameters from raw LM outputs are already in the parameter space Θ and are directly used for rendering, instead of being encoded into CLIP embeddings $z \in \mathcal{Z}_{\text{CLIP}}$.

B.2.3. Minecraft Renderer

Parameter Space. For this renderer, Θ is the asset parameters for Mincraft blocks, and \mathcal{T} is the space of 3D similarity transformation matrices, *i.e.*, of scaling and translation transformations. Note that we prevent rotation transformations in Minecraft, since that could lead to shapes that are impossible to render correctly in Minecraft.

Specifically, Θ is specified in the docstring from Appendix F.1.4 and is expanded below. We introduce two types of primitives that let us construct in-game elements.

The first is set_cuboid. This primitive facilitates the creation of a cuboid within the Minecraft

environment. The function accepts three arguments: (1) A string denoting the Minecraft block type (e.g., "minecraft:white_concrete"); (2) A tuple of three integers representing the scaling along the x, y, and z axes; (3) A boolean flag, fill, that specifies whether the cuboid should be solid or hollow. The cuboid is anchored at the coordinate origin (0,0,0), which corresponds to its front-left-bottom vertex.

The second is delete_blocks. This primitive allows for the deletion of a previously placed cuboid. It accepts a single parameter, which is a tuple of three integers denoting the scaling along the x, y, and z axes. This operation removes the cuboid with its front-left-bottom vertex at the origin (0,0,0), effectively clearing the designated space.

Note that we do not provide the Minecraft block type in the prompt, but instead let the model choose this parameter. Since there is a large amount of Minecraft data files on the web, the model performs decently well in choosing appropriate Minecraft blocks. We also augment this by building safety checks; for example, if the model chooses a Minecraft block that doesn't exist in our version of Minecraft, we will use semantic similarity to choose the most similar block from our library.

Renderer. We use WebGL¹ and Deepslate² for rendering Minecraft builds.

Reparameterization. Similar to Mitsuba, function parameters from LM-generated programs are directly used for rendering without CLIP encoding or reparameterization.

B.2.4. Text-to-Image (T2I) Model Renderer

Parameter Space. We employ MIGC [42] as the backbone model for this renderer, which originally uses a CLIP text encoder [26] and a pre-trained UNet from Stable Diffusion [28] for layout-conditioned text-to-image generation. The parameter space Θ for this renderer is the CLIP text embedding space.

Renderer. We first project the 3D bounding boxes of primitives from an execution output of our representation to a 2D layout under a specified camera viewpoint, and then run the forward pass of the T2I model conditioned on the 2D layout, where each 2D bounding box corresponds to an aforementioned CLIP embedding $\theta \in \Theta$.

Reparameterization. Function parameters from LM-generated programs are directly encoded by the CLIP text encoder using the language templates described in Sec. 5.

¹https://get.webgl.org/

²https://misode.github.io/deepslate/

C. Experiment Details

C.1. Computation Cost

On one scene, LM inference takes <1 min, primitives-based rendering takes <1 min, SDS-based rendering takes ~30 min/object. All experiments run on 1 A5000 GPU with 48GB memory.

C.2. Textual Inversion Optimization

To obtain image-conditioned embedding, we follow the procedure proposed in [6]. For the input image I and text prompt c_j , we first use c_j as guidance of GroundingSAM [27] to obtain the desired mask of the corresponding entity. The cropped region is pad to square and resized to desired resolution, resulting in image target I_j . The background of I_j is set to random grayscale color as used in [31].

We adopt the language template "<class>, 3d model, in the style of <style>" in all the textual inversion experiments. The template is first converted into token embeddings, then using CLIP textencoder g_{CLIP} to transform to embeddings z_j for diffusion model $\hat{\epsilon}_{\text{MVDream}}$. In each textual-inversion iteration, we optimize the token embeddings v_{j1}, v_{j2} for <class> and <style> while freezing others. We use the similar objective as in diffusion model training:

$$\begin{split} v_{j1}^*, v_{j2}^* &= \\ \underset{v_{j1}, v_{i2}}{\arg\min} \, \mathbb{E}_{\eta, \epsilon} \| \epsilon - \hat{\epsilon}_{\text{MVDream}} (\alpha_{\eta} I_j + \alpha_{\eta} \epsilon, \eta, z_j(v_{j1}, v_{j2})) \|_2^2. \end{split}$$

For each entity, we optimize the corresponding embeddings for 100 iterations with learning rate 1e-2. Empirically we find this setting is enough to fit the image conditions. After textual inversion, the embedding z_j is computed with optimized token embeddings, and used to guide the entity optimization as explained in Appendix B.2.

C.3. GraphDreamer Implementation

Since the original paper didn't release the script for automatic scene graph generation, we follow the descriptions in the paper and re-implement this stage to query LM to output scene graphs in json format to avoid manually converting LM outputs to model configurations. The full system prompt is shown below:

```
You are helpful agent and can only write output \hookrightarrow wrapped in ```json```.
```

The full user prompt is shown below, where the given example input and output are taken from the teaser figure of the original paper [7]. In below, {task} is a placeholder for input text prompts of scenes.

```
Please follow the examples in the Visual Genome

→ dataset and generate a scene graph in json

     format that best describes an input text. The
     output must contain four fields: "scene",
     "nodes", "edges", and "attributes".
- "scene" is the description of the input scene.
- "nodes" is a list of objects in the scene.
     Maximum is three objects.
- "edges" is a cyclic list of relationships between
    objects. Namely, each edge is a list of three
     elements: [object1, relationship, object2], where object1 and object2 are in the "nodes" list. The number of edges must be no more than
     number of possible pairs of objects in the "nodes" list.
- "attributes" is a dictionary where each key is an \hookrightarrow object in the "nodes" list and the value is a \hookrightarrow list of its attributes.
Exampl input:
A Wizard standing in front of a Wooden Desk, gazing
    into a Crystal Ball placed on the Wooden Desk,
     with a Stack of Ancient Spell Books sitting on

    → the Wooden Desk and next to the crystal ball.

    json
     "scene": "A Wizard standing in front of

    → Wooden Desk, gazing into a Crystal Ball
    → placed on the Wooden Desk, with a Stack of
    → Ancient Spell Books sitting on the Wooden

     → Desk and next to the crystal ball.",
"nodes": ["Wizard", "Wooden Desk", "Crystal
→ Ball", "Stack of Ancient Spell Books"],
"edges": [
            ["Wizard", "standing in front of", "Wooden
           → Desk"],
["Crystal Ball", "placed on", "Wooden
           → Desk"],

["Wizard", "gazing into", "Crystal Ball"],

["Stack of Ancient Spell Books", "sitting

    → on", "Wooden Desk"],

["Stack of Ancient Spell Books", "next
    → to", "Crystal Ball"]
      "attributes": {
    "Wizard": ["bearded", "robed",
           → "wise-looking"],
"Crystal Ball": ["small", "glowing",
→ "transparent", "mystical"],
           "Stack of Ancient Spell Books":
           "rune-etched"],
           "Wooden Desk": ["sturdy", "carved", "aged"]
Your input:
Your output starts here. The output must be in a
\hookrightarrow valid json format.
```

After generating scene graphs with aforementioned prompt, we follow the released implementation from GraphDreamer to optimize for the final 3D representation, where each object in the node list is represented as an individual object SDF and color field. SDS loss is used to optimize each object and object pairs described in the edge list. When the raw scene graph output contains too many objects and exceeds the memory limitation required in the optimization, we rerun the graph generation step and add "The maximum number of objects is three" in the text prompt and rerun the optimization.



Figure 10. Text-Prompted 3D Generation Comparisons extending Fig. 4.

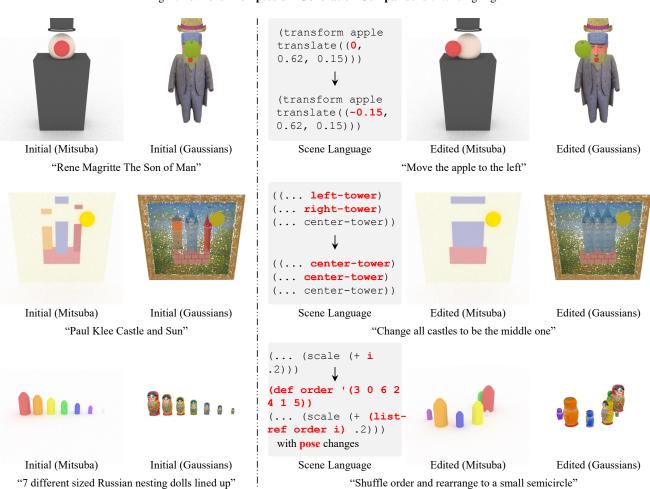


Figure 11. Scene Editing with Language Instructions extending Fig. 7.

Methods	CLIP [13] (†)	Dynamic [12] (†)
4D-fy [2]	0.352	0.2%
4D-fy [2] (w/ prompt variant)	0.354	0.6%
Ours	0.341	5.9%

Table 6. Evaluation for Text-Prompted 4D Generation extending Tab. 4.

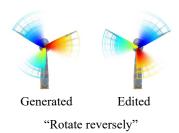


Figure 12. 4D Editing.

C.4. Evaluation Metrics

C.4.1. User Study

The user study is conducted on Prolific³ with 103 users. We provide the following instruction in the user study: "In the following questions, you'll be provided a list of text descriptions and corresponding three generation results. Please choose the one that has best text-alignment, taking into account both the visual quality and the adherence to the layout structure outlined in the text prompt." For each of the 9 scenes being evaluated, we ask the user to choose one of the three video rendering results, generated by our method and two baselines in randomized order. All videos shown in the user study are displayed on the project page.

C.4.2. CLIP-Based Evaluation

We use OpenCLIP model for measuring image-text similarity (Tabs. 3 and 4). We use the model variant with the highest ImageNet zero-shot classification accuracy, OpenCLIP-ViT-H-14-378-quickgelu.

D. Extended Experiment Results

D.1. Text-Prompted 3D Scene Generation.

Qualitative examples for numeric scenes and generic scenes are shown on the website and in Fig. 10, respectively.

D.2. Text-Prompted 4D Scene Generation

Representation. The 4D entity function mentioned in Sec. 6.1 is defined as <4D-entity-func> in the DSL defined in Tab. 5.

Analysis. Allowing for a flexible set of primitive entities is crucial to make our representation suitable for generating 4D scenes of different scales, including objects with moving

parts (*e.g.*, the wind turbine from Fig. 6) and scenes with moving objects (*e.g.*, the carousel). This is in contrast to prior works using primitives chosen from a fixed set [30, 36] or fixing the granularity to be object-centric [15].

Moreover, the hierarchical scene structure encapsulated by our program-based representation makes it possible to represent 4D scenes compactly, serving as a regularization for generation output. Multiple entities, such as outputs from the function horse from the carousel scene in Fig. 6, can be grouped into one function horses and thereby share the same temporal transformation. Writing composible functions for entity grouping effectively reduces the dimension of the temporal motion space and improves motion fidelity.

Extended Quantitative Results. On top of the evaluation in Tab. 4 with the same set of prompts for 4D-fy and ours, we evaluate 4D-fy with prompt variants that more explicitly indicate scene dynamics. Specifically, we use the following three prompts: "a solar system model with moving planets", "a toy wind turbine with rotating blades", and "carousel with a small canopy rotating". Results are reported as 4D-fy (w/ prompt variants) in Tab. 6. We observe a small increment in CLIP similarity and dynamic degrees in 4D-fy results with the prompt variants, but still with a relatively small motion compared to ours.

D.3. Text-Prompted 3D and 4D Scene Editing

Fig. 11 shows further qualitative experiment results under the same setup as Fig. 7. The same method applies to 4D editing, with results included in Fig. 12.

D.4. Roles of Representation Components

Below we discuss the roles of representation components, P (programs), W (words), and Z (embeddings).

We ablate the roles of P and W on the 3D editing task as follows: (i) No-P, replacing the scene language with a leaf entity list (i.e., a list of word-pose tuples) before querying language models (LMs) to edit, (ii) No-W, replacing function names with random strings, and (iii) No-P-No-W, removing words from (i).

We run these variants, together with baseline methods, to edit the top-left scene in Fig. 10. Input prompts and results are shown in Fig. 13(a). Removing P and/or W degrades the accuracy of the results, suggesting that both components contribute to an intuitive and accurate editing interface. On the other hand, the two baseline methods do not encode precise spatial information of scene components and require regenerating the scene (we use prompt "A basket upsidedown with toys in the basket"), failing to preserve the original generated content.

Embeddings Z are necessary for image-prompted editing (Fig. 8). For generation tasks, W and Z are both required by neural renderers, and we ablate P by query-

³https://www.prolific.com/

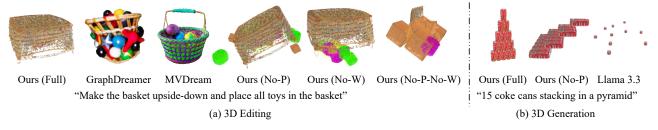


Figure 13. Ablations.

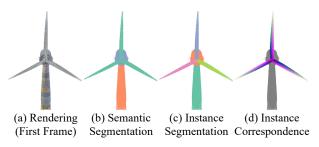


Figure 14. Visualizations of Discriminative Maps.

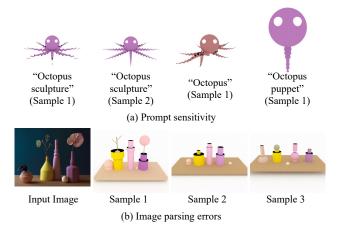


Figure 15. Failure Cases.

ing LMs to directly generate entity lists. As shown in Fig. 13(b), removing programs harms LM accuracy; alternative backbone Llama has inferior performance.

D.5. Visualization of Discriminative Information

Several pieces of discriminative information can be directly obtained with the proposed Scene Language: semantic maps in Fig. 14(b), as words represent per-entity semantics; instance segmentation in Fig. 14(c), as the representation is compositional with separable instances; correspondence of the repeated instances in Fig. 14(d), as programs specify repetitions existing in a scene; dense temporal correspondence for 4D scenes, as shown in Fig. 6.

E. Limitations

The current inference pipeline inherits limitations of the backbone pre-trained models.

LM/VLM errors. For text-conditioned tasks, minor variations in textual scene descriptions can lead to large quality differences in the output as shown in Fig. 15 (a). For image-conditioned tasks, input images are parsed with the backbone visual language model. In the example in Fig. 15 (b), with the same input image, parsing results have high variance across multiple inference runs.

T2I Model Bias. While the non-neural engines adopted are fully controllable and correct, neural-based engines may introduce additional errors, *e.g.*, the rendered umbrella is not fully folded (Fig. 10) due to the bias in T2I models. Furthermore, the controls over texture and shapes are not disentangled for neural engines, resulting in mixed texture and shape changes in Fig. 8 as they are both affected by embeddings.

While this work provides a viable inference method for the proposed representation that leverages the commonsense knowledge and code-writing capability of LMs and expressive renderings from T2I models, addressing the weaknesses inherited from these pre-trained models would further improve the robustness, complexity, and output quality for downstream tasks. We leave these as future directions to improve the inference of the Scene Language.

F. Language Model Prompts and Responses

F.1. Language Model Prompts

F.1.1. Text- and Image-Conditioned Scene Generation

In Sec. 5, we introduced an inference method for the representation by prompting LMs. The full system prompt is displayed below. The system prompt defines the data types and the function headers of macros from the DSL in Tab. 5, written in Python.

```
You are a code completion model and can only write

→ python functions wrapped within ```python```.

You are provided with the following `helper.py`

→ which defines the given functions and

→ definitions:

```python
```

```
Inis module contains a Domain-Specific Language \hookrightarrow (DSL) designed with built-in support for loops and functions for \hookrightarrow shape construction and transformation.
"""This module contains a Domain-Specific Language
from typing import NamedTuple, Any, Callable,
import math
import numpy as np
 type aliases and DSL syntax sugar
type allases and DSL syntax sugar
P = Any # 3D vector, e.g., a point or direction
T = Any # 4x4 transformation matrix
Shape = list[dict[str, Any]] # a shape is a list

of primitive shapes
shape function library utils
def register(docstring: str):
 Registers a function whose name must be unique.
 → Provide keyword argument defaults for
 def library_call(func_name: str, **kwargs) ->
 Shape:
 Call a function from the library and return its \hookrightarrow outputs. You are responsible for \hookrightarrow registering the function with `register`.
 Args:
 func_name (str): Function name.
 \star\star kwargs\colon Keyword arguments passed to the
 1.0)) -> Shape:
 Constructs a primitive shape.
 Args:
 name: str - 'cube', 'sphere', or
 name: Str - Cube, sphere, of

→ 'cylinder'.
shape_kwargs: dict[str, Any] - keyword

→ arguments for the primitive shape.

- For 'cube': {'scale': P} - 3-tuple of
 \hookrightarrow floats for scaling along x, y, z \hookrightarrow axes.
 - For 'sphere': {'radius': float} -
 → radius of the sphere.

- For 'cylinder': {'radius': float,

'p0': P, 'p1': P}

- radius: float - radius of the
 \hookrightarrow cylinder.
- p0: P - 3-tuple of floats for the
 → start point of the cylinder's
→ centerline.
 - pl: P - 3-tuple of floats for the

→ end point of the cylinder's

→ centerline.
 color: Tuple[float, float, float] - RGB \hookrightarrow color in range [0, 1]^3.
 Returns:
 Shape - the primitive shape.
 'primitive_call('cube',
 shape_kwargs={'scale': (1, 2, 1)})`
Returns a cube with corners (-0.5, -1,
 → -0.5) and (0.5, 1, 0.5).
- `primitive_call('sphere',
→ shape_kwargs={'radius': 0.5})
 Returns a sphere with radius 0.5, with
 → bounding box corners (-0.5, -0.5,

→ -0.5) and (0.5, 0.5, 0.5).

- `primitive_call('cylinder',

→ shape_kwargs={'radius': 0.5, 'height':

→ 1})`
```

```
Returns a cylinder with radius 0.5, \hookrightarrow height 1, with bounding box corners \hookrightarrow (-0.5, -0.5, -0.5) and (0.5, 0.5, \hookrightarrow 0.5).
control flows
def loop(n: int, fn: Callable[[int], Shape]) ->
 Shape:
 Simple loop executing a function `n` times and
 \hookrightarrow concatenating the results.
 Aras:
 n (int): Number of iterations.
 fn (Callable[[int], Shape]): Function that

 takes the current iteration index
 returns a shape.

 Returns:
 Concatenated shapes from each iteration.
shape manipulation
def concat_shapes(*shapes: Shape) -> Shape:
 Combines multiple shapes into a single shape.
def transform_shape(shape: Shape, pose: T) ->

 Shape:
"""

 Aras:
 shape: Shape
pose: T - If pose is A @ B, then B is

→ applied first, followed by A.
 Returns:
 The input shape transformed by the given
 """
→ pose.
pose transformation
 \begin{array}{lll} \textbf{def} & rotation_matrix (angle: float, direction: P, \\ & \hookrightarrow & point: P) \ \rightarrow \ T: \\ \end{array}
 angle (float) : the angle of rotation in
 \rightarrow radians direction (P): the axis of rotation point (P): the point about which the
 def translation_matrix(offset: P) -> T:
 Args:
 offset (P) : the translation vector
def scale_matrix(scale: float, origin: P) -> T:
 scale (float) - the scaling factor, only

→ uniform scaling is supported

origin (P) - the origin of the scaling
 → operation
def identity_matrix() -> T:
 Returns the identity matrix in SE(3).
calculate locations and sizes of shape bounding

→ boxes

def compute_shape_center(shape: Shape) -> P:
 Returns the shape center.
def compute_shape_min(shape: Shape) -> P:
 Returns the min corner of the shape.
def compute_shape_max(shape: Shape) -> P:
 Returns the max corner of the shape.
```

```
def compute_shape_sizes(shape: Shape) -> P:
 Returns the shape sizes along x, y, and z axes.
STRICTLY follow these rules:
{f 1.} Only use the functions and imported libraries in
 helper.py
2. You can only write functions. Follow a modular
 approach and use the `register` decorator to
 define semantic shapes or shape groups.
3. Camera coordinate system: +x is right, +y is up,
 +z is backward.
4. You can use shape primitives to approximate
→ shape components that are too complex. You must
→ make sure shape have correct poses. Be careful
→ about `set_mode` and `set_to` from
→ `primitive_call`.

5. You must use `library_call` to call registered
 functions.
6. Use `compute_shape_*` from `helper.py` if
 possible to compute transformations.
You should be precise and creative.
```

The full user prompt for image or text-conditioned 3D generation is displayed below. It includes an example valid program, and the task specification indicated with a placeholder {task}. For text-conditioned generation (Sec. 6.1), it is replaced with the input textual scene description. For image-conditioned generation (Sec. 6.2), it is replaced with "Reconstruct the input scene", and the input image is also fed into LM.

```
Here are some examples of how to use `helper.py`:
from helper import *
A pile of books on a desk
@register("book")
def book(scale: P) -> Shape:
 @register("books")
def books(width: float, length: float, book_height:
 float, num_books: int)
 -> Shape:
 def loop_fn(i) -> Shape:
 book_shape = library_call('book')
 scale=(width, book_height, length))
 book_shape = transform_shape(book_shape,
 translation_matrix([np.random.uniform(]
 FIRST translate
 book center
 \hookrightarrow compute_shape_center(book_shape)
 must be computed AFTER transformation!!
 return transform_shape(book_shape,
 \hookrightarrow rotation_matrix(np.random.uniform(-0.1,
 → 0.1), direction=(0, 1, 0),
→ point=book_center)) # THEN tilt
 return loop(num_books, loop_fn)
@register("desk")
def desk(scale: P) -> Shape:
 return primitive_call('cube', color=(.4, .2,

→ .1), shape_kwargs={'scale': scale})
@register('desk with books')
```

# F.1.2. Scene Editing

For text-prompted scene editing (Sec. 6.1), we prompt the LM in two rounds, first with a textual scene description with the same protocol from Sec. 6.1, and then with an editing instruction, e.g., "move the apple to the left". In the second round, the system prompt remains the same as Appendix F.1.1. The user prompt is as follows, where {program} is the LM output from first round, and {task} is the editing instruction.

# F.1.3. 4D Generation

For 4D generation, we include one more macro definition in the system prompt as shown below, with the remaining system prompt the same as above:

```
***Toython

def register_animation(docstring: str | None =

→ None):

"""

Registers an animation function which is stored

→ in the global `animation_func`. You can

→ pass an optional docstring.

If you register a function, there a couple of

→ rules:

- That function should never be called

→ anywhere else in the program. This

→ function gets used later by the

→ rendering engine.

- This function needs a return type of

→ `Generator[Shape, None, None]`.

"""
```

...

The full user prompt for 4D generation is displayed below:

```
Here are some examples of how to use `helper.py`:
from helper import *
three ghosts chasing a yellow pacman
@register()
def pacman() -> Shape:
 return primitive_call('cube', color=(1, 1, 0),

 scale=.8)

@register()
def ghosts() -> Shape:
 translation_matrix([i, 0, 0])
))
@register()
def ghost(color) -> Shape:
 return primitive_call('sphere', color=color,

 scale=.8)

@register_animation()
def pacman_chase_animation() -> Generator[Shape,
 None, None]:
 an animated scene
 total_frames = 4 # Number of frames in the
 → animation
 for frame in range(total_frames):
 pacman_x = - frame / total_frames
ghost_x_offset = - 2 * frame / total_frames
 # Move pacman and ghost
 pacman
 translation_matrix([pacman_x, 0, 0]))
 ghosts =

 transform_shape(library_call('ghosts'),
 translation_matrix([2 + ghost_x_offset,
 # Export the shape, which is a frame in the
 animation
 yield concat_shapes(pacman, ghosts)
IMPORTANT: THE FUNCTIONS ABOVE ARE JUST EXAMPLES,
 YOU CANNOT USE THEM IN YOUR PROGRAM!
Now, write a similar program for the given task:
from helper import *
{task}
```

# F.1.4. Minecraft Rendering

We adapt the prompts from Appendix F.1.1 to prompt LM to generate Minecraft-compatible outputs. Note that programs generated in this section can still be rendered using Mitsuba renderer, as shown in Fig. 5, by converting each Minecraft block from LM outputs to a Mitsuba cube primitive with the corresponding location and with the color set as the average color of the Minecraft block.

Specifically, we remove rotation\_matrix and reflection\_matrix from the system prompt in Appendix F.1.1 and change the function header for primitive\_call to the follows:

```
name: str - the name of the primitive
 \hookrightarrow action
 support 'set_cuboid', 'delete_blocks'
 ...: Any - additional arguments for the

→ primitive action
For 'set_cuboid':
 - block_type: a string that denotes

→ the block type, e.g. 'oak_log'.

→ THESE MUST BE VALID LITEMATIC

→ THE MUST BE VALID LITEMATIC

→ THE
 BLOCK TYPES.
 - block_kwargs: a dict[str, str] of
 → additional properties to define
→ a block's state fully, e.g. for
→ 'oak_log', we need to define
 → the axis with possible values
→ 'x', 'y', or 'z'
- scale: a list of 3 elements,
 \hookrightarrow denoting the scaling along the

 → positive x, y, and z axises
 → respectively. IMPORTANT: THESE
 → CAN ONLY BE INTEGERS!

 - fill: a boolean, describing
 \hookrightarrow whether the cuboid should be

 ← filled, or be hollow. Hint:

 this can be useful for creating
 structures that should be
 → hollow, such as a building.
For 'delete_blocks':
 scale: a list of 3 elements,
 → denoting the scaling along the
→ positive x, y, and z axises
→ respectively. IMPORTANT: THESE
→ CAN ONLY BE INTEGERS!
 Returns:
 Shape
 For 'set_cuboid': a cuboid composed of
 → Minecraft blocks, with the closest
→ block at (0, 0, 0) and furthest
→ (right, back-most) block at
← (scale[0], scale[1], scale[2]).
For 'delete_blocks': an empty
← cuboid-shaped space without any
 → blocks, starting from the closest
→ block at (0, 0, 0) and furthest
→ (right, back-most) block at
 (scale[0], scale[1], scale[2]).
```

And we change the example program for user prompt accordingly to the follows:

```
@register()
def red_cube() -> Shape:
 return transform_shape(
 @register()
def blue_pyramid(n: int = 4) -> Shape:
 blue_pyramid(n: int = 4) → snape:
def create_pyramid_layer(i):
 # Logic here is that for the ith layer, it
 → has dims (2*i + 1) x1x(2*i + 1.
 # We need to then shift that in the x
 \hookrightarrow dimension to center it, and then also
 → in the y dimension to lift to the right

→ in the y dimension to lift to the right

→ layer of the pyramid.

side_length = i * 2 + 1

last_layer_length = n * 2 + 1
 x_z_{offset} = (last_layer_length -
 \rightarrow side_length) // 2
y_offset = n - i - 1
 return transform_shape(
 primitive_call('set_cuboid',

→ block_type='minecraft:lapis_block',

 scale=(side_length, 1,

 translation_matrix([x_z_offset,
 \hookrightarrow y_offset, x_z_offset]))
 return loop(4, create_pyramid_layer)
A forest of trees of varying heights.
@register()
def forest(leaf_size: int = 3) -> Shape:
 # Double for loop for placing the trees
tree_padding = leaf_size * 2 + 3 # This is how

→ far the center point of each tree should be
 → from each other
return loop(4, lambda i: loop(4, lambda j:
 translation_matrix([i *
 tree_padding]))))
@register()
def simple_tree(height: int = 4) -> Shape:
 return concat_shapes(
 library_call('trunk', trunk_height=height),
 transform_shape(library_call('leaves',
 → leaf_size=3), # If you pass in extra

→ arguments to library_call, they need to

→ be NAMED arguments. Passing in 3 here

→ without "leaf_size" will error.
 translation_matrix([-1,
 \hookrightarrow height, -1]) # Center \hookrightarrow the leaves on top of
 the trunk
→ block_twargs={'distance': '7',

→ 'persistent': "true", 'waterlogged':

→ "false"}, scale=(leaf_size, leaf_size,

→ leaf_size), fill=True)
 register()

 trunk_height, 1), fill=True)
```

# F.2. Language Model Outputs

#### F.2.1. Text-Conditioned 3D Generation

### **Example 1.** This example corresponds to Fig. 1.

Input: "Moai in Ahu Akivi, with slight
variations".

```
Here's a program to create Moai statues in Ahu

→ Akivi with slight variations:

from helper import *
Moai in Ahu Akivi, with slight variations
@register()
→ 0.45, 0.45), shape_kwargs=('scale':

→ (scale*0.2, scale*0.4, scale*0.3)})

nose = transform_shape(nose,
 return concat_shapes(head, nose)
@register()
return body
@register()
def moai(scale: float) -> Shape:
 head = library_call('moai_head', scale=scale)
body = library_call('moai_body', scale=scale)
 head_min = compute_shape_min(head)
body_max = compute_shape_max(body)
 head = transform shape(head,

 translation_matrix((0, body_max[1] -
 \hookrightarrow head_min[1], 0)))
 return concat_shapes(body, head)
@register()
def ahu_platform(width: float, height: float,
→ depth: float) -> Shape:
 def moai_with_variation(base_scale: float) ->
 scale_variation = np.random.uniform(0.9, 1.1)
rotation_variation = np.random.uniform(-0.05,
 moai_center = compute_shape_center(moai_statue)
 @register()
def ahu_akivi_scene() -> Shape:
```

```
def create_moai(i: int) -> Shape:
 moai = library_call('moai_with_variation',

→ base_scale=1.5)
moai_bottom = compute_shape_min(moai)[1]
x_position = (i - 3) * 2 # Distribute 7
 → Moai evenly
return transform_shape(moai,
 → platform_top - moai_bottom, 0)))
 moai_statues = loop(7, create_moai)
 return concat_shapes(platform, moai_statues)
This program creates a scene of Moai statues in Ahu

→ Akivi with the following components:
1. `moai_head`: Creates a simplified Moai head
→ using cubes for the main head and nose.
2. `moai_body`: Creates a simplified Moai body
 using a cube.
3. `moai`: Combines the head and body to form a
on which the Moai stand.
5. `moai_with_variation`: Applies slight variations
a platform and seven Moai statues.
The scene features seven Moai statues standing on a

→ stone platform, similar to the real Ahu Akivi
→ site. Each Moai has slight variations in size
→ and rotation to add visual interest and realism

 to the scene.
```

# Example 2. This example corresponds to Fig. 2. Input: "a chessboard at game start". Output:

```
Here's a program to create a chessboard at game
⇔ start using the provided `helper.py`:
···python
from helper import *
a chessboard at game start
@register("chess_square")
def chess_square(color: tuple[float, float, float])
→ -> Shape:
 return primitive_call('cube', color=color,

→ shape_kwargs={'scale': (0.125, 0.02,
 \hookrightarrow 0.125)})
 register ("chessboard")
def chessboard() -> Shape:
 def loop_fn(i) -> Shape:
 row = i // 8
col = i % 8
 color=color)
 return loop(64, loop_fn)
@register("chess_pawn")
def chess_pawn(color: tuple[float, float, float])
 -> Shape:
```

```
head = transform_shape(head,

→ translation_matrix((0, 0.115, 0)))
return concat_shapes(base, body, head)
@register("chess_rook")
def chess_rook(color: tuple[float, float, float])
 -> Shape:
@register("chess knight")
def chess_knight(color: tuple[float, float, float])
 -> Shape:
 translation_matrix((0.01, 0.11, 0)))
 head = transform_shape(head,

\hookrightarrow rotation_matrix(0.3, (0, 0, 1), (0, 0.11,

\hookrightarrow 0)))
 return concat_shapes(base, body, head)
 egister("chess_bishop")
def chess_bishop(color: tuple[float, float, float])
 -> Shape:
 Head - transform_shape(head,

→ translation_matrix((0, 0.13, 0)))

top = primitive_call('cylinder', color=color,

→ shape_kwargs={'radius': 0.01, 'p0': (0,

→ 0.13, 0), 'p1': (0, 0.16, 0)})
 return concat_shapes(base, body, head, top)
@register("chess_queen")
def chess_queen(color: tuple[float, float, float])
 -> Shape:
 \hookrightarrow translation_matrix((0, 0.16, 0)))
 return concat_shapes(base, body, crown, top)
 egister("chess_king")
def chess_king(color: tuple[float, float, float])
 -> Shape:
```

```
crown = transform shape(crown,
 cross_v = transform_snape(cross_v)

→ translation_matrix((0, 0.215, 0)))

cross_h = primitive_call('cube', color=color,

→ shape_kwargs={'scale': (0.06, 0.02, 0.02)})

cross_h = transform_shape(cross_h,
 → translation_matrix((0, 0.215, 0)))

return concat_shapes(base, body, crown,

→ cross_v, cross_h)
@register("chess_pieces")
def chess_pieces() -> Shape:
 white = (0.9, 0.9, 0.9)
 black = (0.1, 0.1, 0.1)
 pieces = []
 # Place pawns
 for i in range(8):
 white_pawn = library_call('chess_pawn',
 → color=white)
 black_pawn = library_call('chess_pawn',
 pieces.append(transform_shape(white_pawn,
 → translation_matrix((i * 0.125, 0.02, 0.125))))
pieces.append(transform_shape(black_pawn,
 for i, piece in enumerate(piece_order):
 white_piece
 color=white)
 black_piece =
 pieces.append(transform_shape(white_piece,
 \rightarrow translation_matrix((i * 0.125, 0.02,
 \hookrightarrow 0))))
 pieces.append(transform_shape(black_piece,
 \hookrightarrow translation_matrix((i * 0.125, 0.02,
 \hookrightarrow 0.875))))
 return concat_shapes(*pieces)
@register("chessboard_at_game_start")
def chessboard_at_game_start() -> Shape:
 board = library_call('chessboard')
 pieces = library_call('chess_pieces')
 return concat_shapes(board, pieces)
This program creates a chessboard at game start \hookrightarrow with the following components:
1. A chessboard made of alternating white and black
 squares.
2. Chess pieces for both white and black sides,
 including pawns, rooks, knights, bishops,
 queens, and kings.

 The pieces are placed in their correct starting
 → positions on the board.

To use this program and generate the chessboard at \hookrightarrow \, game start, you would call:
···python
chessboard scene =

 library_call('chessboard_at_game_start')

This will return a complete chessboard with all

→ pieces in their starting positions.
```

#### F.2.2. Text-Conditioned 3D Editing

In this task, for each example, we prompt LM in two rounds—the first round with a scene description as task specification, and the second round with editing instructions. LM outputs in the first round are omitted. Rendering outputs are shown in Fig. 7 and Fig. 11.

Example 1. Input scene description: "Bramante Staircase, Vatican Museums". Input editing instruction: "shrink staircase radius by 80%".

Output:

```
Here's the minimally edited program that shrinks \hookrightarrow the staircase radius by 80%:
···python
from helper import *
Shrink staircase radius by 80%
@register()
def spiral staircase (radius: float, height: float,
def spiral_StaffedSt(:=:
 num_steps: int) → Shape:
 dof loop fn(i: int) → Shape:
 angle = (i / num_steps) * 2 * math.pi
step_width = 0.8 * radius
step_height = height / num_steps
step_depth = 0.3 * radius
 step = library_call('stair_step',
 y_offset = i * step_height
 x_offset = radius * math.cos(angle)
z_offset = radius * math.sin(angle)
 return transform_shape(step,

→ rotation_matrix(angle, (0, 1, 0),
→ (x_offset, y_offset, z_offset)))
 return loop(num_steps, loop_fn)
@register()
def central_column(radius: float, height: float) ->
\hookrightarrow Shape:
 return primitive_call('cylinder', color=(0.7,
 \hookrightarrow 0.7, 0.7),
 shape_kwargs={'radius':
 → radius, 'p0': (0, 0,
→ 0), 'p1': (0, height,
→ 0)})
@register()
def bramante staircase() -> Shape:
 staircase_radius = 5.0 * 0.2 # Shrink
 → staircase radius by 80% staircase_height = 15.0
 num_steps = 60
column_radius = 0.5 * 0.2 # Shrink column

→ radius proportionally

 stairs = library_call('spiral_staircase',

→ radius=staircase_radius,

→ height=staircase_height,

 → num_steps=num_steps)
column = library_call('central_column',
 return concat_shapes(stairs, column)
In this edited version, I've made the following \hookrightarrow changes to shrink the staircase radius by 80%:
```

**Example 2.** Input scene description: "a 8-layer 3-color Jenga set at game start". Input editing instruction: "remove 2 blocks from second top layer and the tower should not fall".

#### Output:

```
Here's the minimally edited program to remove 2

→ blocks from the second top layer of the Jenga

→ tower:

 ···python
 from helper import *
 Remove 2 blocks from second top layer and the tower
 @register()
 def jenga_block(color: tuple[float, float, float])
 → -> Shape:
"""Create a single Jenga block"""

return primitive_call('cube', color=color,

→ shape_kwargs={'scale': (0.75, 0.5, 2.25)})
float]], remove_blocks: list[int] = []) ->
 Shape:
 Create a layer of 3 Jenga blocks, optionally
 removing specified blocks""
 def block_fn(i: int) -> Shape:
 if i in remove_blocks:
 return []
 block = library_call('jenga_block',
 ⇔ color=colors[i])
 if is_horizontal:
 transform = translation_matrix((i *
 \leftrightarrow 0.75 - 0.75, y_offset, 0))
 else:
 transform = translation_matrix((0,
 \begin{array}{lll} \hookrightarrow & \text{y_offset, i} * (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75)) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform} \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform } (0.75 - 0.75) \\ \text{transform} = & \text{transform} \\
 return transform_shape(block, transform)
 return loop(3, block_fn)
 @register()
```

```
def layer_fn(i: int) -> Shape:
 is_horizontal = i % 2 ==

 is_horizontal=is_horizontal,

 y_offset=y_offset, colors=layer_colors,
 remove_blocks=remove_blocks)

 return loop(8, layer fn)
@register()
tower_min = compute_shape_min(tower)
base_max = compute_shape_max(base)
 return concat_shapes (
 base,
 transform_shape(tower,

→ translation_matrix((0, base_max[1] -
 \hookrightarrow tower_min[1], 0)))
)
This modified version of the program removes \ensuremath{\mathbf{2}}
\hookrightarrow blocks from the second top layer of the Jenga \hookrightarrow tower. Here are the changes made:
\hookrightarrow top layer (index 6, since we're counting from
3. The rest of the program remains the same, \hookrightarrow ensuring that the tower is still placed on the \hookrightarrow base and the overall structure is maintained.
These changes will result in a Jenga tower with two \hookrightarrow blocks missing from the second top layer, while \hookrightarrow the rest of the tower remains intact. The tower
 should not fall because the top layer is still
\hookrightarrow fully supported by the remaining block in the \hookrightarrow second top layer.
```

**Example 3.** Input scene description: "a fractal tree-like structure". Input editing instruction: "make branching structure to be trinary and 3D".

```
sub_branch_length = length * 0.7
sub_branch_radius = radius * 0.6
 angle = 0.5 # ~28.6 degrees
 left_transform = translation_matrix((0, length,
 \leftrightarrow 0)) @ rotation_matrix(angle, (0, 0, 1), (0, \leftrightarrow 0, 0))
 right_transform = translation_matrix((0,

→ length, 0)) @ rotation_matrix(-angle, (0,

→ 0, 1), (0, 0, 0))
 return concat_shapes (
 main_branch,
 transform_shape(right_branch,
 base_radius.

Shape:

tree = library_call('branch',

→ length=base_length, radius=base_radius,

→ depth=depth)

Approved shape min(tree)
 tree_min = compute_shape_min(tree)
 return transform_shape(tree,

→ translation_matrix((-tree_min[0],

→ -tree_min[1], 0)))
This program creates a fractal tree-like structure

→ using function recursion. Here's how it works:

1. The 'branch' function is the core of the
 recursion. It creates a cylinder for the main
\hookrightarrow branch and then recursively creates two smaller \hookrightarrow branches at its top, rotated at angles.
2. The recursion depth is controlled by the `depth`

 parameter. When `depth` reaches 0, it just
 returns a single cylinder.

3. For each recursive call, the length and radius

→ of the branches are reduced by a factor.

→ origin.

This shape is interesting because:
- It's self-similar at different scales, which is a
 characteristic of fractals.
- It's not a simple geometric shape like a pyramid, \hookrightarrow but a complex structure built from simple
 components.

 → The recursive nature of the function allows for
 → easy adjustment of the complexity by changing
 → the `depth` parameter.
 - It resembles natural structures like trees or

\hookrightarrow blood vessels, demonstrating how complex

→ natural forms can arise from simple recursive

 rules.
You can create trees of different complexity by \hookrightarrow adjusting the 'depth' parameter when calling \hookrightarrow 'fractal_tree'. For example:
```

```
- `library_call('fractal_tree', base_length=1.0,

→ base_radius=0.1, depth=3)` for a simpler tree
- `library_call('fractal_tree', base_length=1.0,

→ base_radius=0.1, depth=7)` for a more complex

→ tree

This shape demonstrates the power of recursive

→ functions in creating complex, naturalistic

→ forms from simple rules.
```

**Example 4.** Input scene description: "Rene Magritte The Son of Man". Input editing instruction: "move the apple to the left".

```
Here's the minimally edited program that moves the
\hookrightarrow apple to the left:
···python
from helper import *
Move the apple to left
@register()
def suit(width: float, height: float, depth: float)
\hookrightarrow -> Shape:
 return primitive_call('cube', color=(0.1, 0.1,

\(\to \) 0.1), shape_kwargs={'scale': (width,
 → 0.1), shape_kwar
→ height, depth)})
def head(radius: float) -> Shape:
 return primitive_call('sphere', color=(0.9,
 register()
def hat(radius: float, height: float) -> Shape:
 brim = primitive_call('cylinder', color=(0.1,

→ 0.1, 0.1), shape_kwargs={'radius': radius *

→ 1.2, 'p0': (0, 0, 0), 'p1': (0, height *

→ 0.1, 0)})
 top = primitive_call('cylinder', color=(0.1,
 top = primitive_call(cylinder, color=(0.1,

→ 0.1, 0.1), shape_kwargs={'radius': radius,

→ 'p0': (0, height * 0.1, 0), 'p1': (0,

→ height, 0)})

return concat_shapes(brim, top)
@register()
def son_of_man() -> Shape:
 # Create the suit
 suit_shape = library_call('suit', width=0.6,
 height=1.0, depth=0.3)
 head_shape = library_call('head', radius=0.15)
head_shape = transform_shape(head_shape,
 \hookrightarrow translation_matrix((0, 0.6, 0)))
 apple_shape = transform_shape(apple_shape,

→ translation_matrix((-0.15, 0.62, 0.15))) #

→ Changed x-coordinate to -0.15
 # Create the hat
 hat_shape = library_call('hat', radius=0.12,

→ height=0.15)
 hat_shape = transform_shape(hat_shape,
 \leftrightarrow translation_matrix((0, 0.78, 0)))
 figure = concat_shapes(suit_shape, head_shape,

→ apple_shape, hat_shape)
```

**Example 5.** Input scene description: "Paul Klee Castle and Sun". Input editing instruction: "change all castles to be the middle one".

#### Output:

```
Here's the minimally edited program to change all
\hookrightarrow castles to be the middle one:
from helper import *
Change all castles to be the middle one
@register()
def rectangle(width: float, height: float, color:
tuple[float, float, float]) -> Shape:
return primitive_call('cube',
 \hookrightarrow 0.01)}, color=color)
 register()
@register()
def sun(radius: float) -> Shape:
 return primitive_call('sphere'

 shape_kwargs={'radius': radius},
 color=(1.0, 0.8, 0))

→ height=height, color=color)

 register()
→ height=width/2, color=color)
tower_height = compute_shape_sizes(tower)[1]
return concat_shapes(
```

```
tower,
 transform_shape(roof,
 @register()
def castle() -> Shape:
 library_call('castle_block', width=0.8,
 base = library_call(castle_block , width=0.

→ height=0.4, color=(0.5, 0.5, 0.7))

center_tower = library_call('castle_tower',

→ width=0.25, height=0.7, color=(0.5, 0.5,

→ 0.7))
 base_width = compute_shape_sizes(base)[0]
 center_tower_width

→ compute_shape_sizes(center_tower)[0]

 return concat shapes (
 transform_shape(center_tower,
 transform_shape(center_tower,
 \hookrightarrow translation_matrix((0, 0.4, 0)))
@register()
def castle_and_sun() -> Shape:
 bg = library_call('background')
castle_shape = library_call('castle')
sun_shape = library_call('sun', radius=0.15)
 return concat_shapes(
 bg,
 transform_shape(castle_shape,
 -0.3, 0.01))),
)
In this edited version, I made the following \ensuremath{\hookrightarrow} changes to fulfill the instruction "Change all
\hookrightarrow castles to be the middle one":

 In the `castle()` function, I removed the
 ∴ 'left_tower` and `right_tower` variables.
 I changed the `base` color to match the center
 ∴ tower's color: `(0.5, 0.5, 0.7)`.

3. I replaced the left and right towers with two
→ additional center towers.4. I adjusted the positioning of the three center
 \mapsto towers to be evenly spaced across the base.
Now, when the `castle_and_sun()` function is \hookrightarrow called, it will create a scene where all the \hookrightarrow castle towers are identical to the original
\hookrightarrow middle tower, fulfilling the given instruction.
```

**Example 6.** Input scene description: "7 different sized Russian nesting dolls lined up". Input editing instruction: "Shuffle order and rearrange to a small semicircle".

```
Output:
```

```
Here's the minimally edited program to change all

→ castles to be the middle one:

"python
from helper import *

"""

Change all castles to be the middle one
"""
```

```
def rectangle(width: float, height: float, color:
tuple[float, float, float]) -> Shape:
return primitive_call('cube',
 ⇔ shape_kwargs={'scale': (width, height,
 \hookrightarrow 0.01)}, color=color)
 egister()
→ 0.01)}, color=color)
return transform_shape(triangle_shape,

 translation_matrix((0, height/2, 0)))

@register()
def sun(radius: float) -> Shape:
 return primitive_call('sphere'
 def castle_block(width: float, height: float,
→ color: tuple[float, float, float]) -> Shape:
return library_call('rectangle', width=width,

→ height=height, color=color)

def castle_tower(width: float, height: float,
return concat_shapes (
 tower,
 transform shape (roof,

 translation_matrix((0, tower_height,
 \hookrightarrow 0)))
@register()
base_width = compute_shape_sizes(base)[0]
 center_tower_width
 return concat_shapes (
 base,
 transform_shape(center_tower,

 translation_matrix((-base_width/4, 0.4,
 0))),
 transform_shape(center_tower,

 translation_matrix((base_width/4, 0.4,

 ○))),

 transform_shape(center_tower,
 → translation_matrix((0, 0.4, 0)))
def background() -> Shape:
 @register()
def castle_and_sun() -> Shape:
 bg = library_call('background')
 castle_shape = library_call('castle')
 sun_shape = library_call('sun', radius=0.15)
 return concat_shapes (
 transform_shape(castle_shape,
 \leftrightarrow translation_matrix((0, -0.3, 0.01))),
 transform_shape(sun_shape,

→ translation_matrix((0.5, 0.5, 0.02)))
```

```
In this edited version, I made the following

changes to fulfill the instruction "Change all

castles to be the middle one":

1. In the `castle()` function, I removed the

left_tower` and `right_tower` variables.

2. I changed the `base` color to match the center

tower's color: `(0.5, 0.5, 0.7)`.

3. I replaced the left and right towers with two

additional center towers.

4. I adjusted the positioning of the three center

towers to be evenly spaced across the base.

Now, when the `castle_and_sun()` function is

called, it will create a scene where all the

castle towers are identical to the original

middle tower, fulfilling the given instruction.
```

# F.2.3. Text-Conditioned 4D Generation

**Example 1.** Input: "carousel with a small canopy".

```
Here's a program that creates a carousel with a \hookrightarrow small canopy using the provided 'helper.py':
···python
from helper import *
carousel with a small canopy
@register()
return base
@register()
return platform
@register()
def carousel_pole() -> Shape:
 return pole
def carousel_horse() -> Shape:
 horse = concat_shapes(body, head, legs)
 return transform_shape(horse,

→ translation_matrix((0, 1, 0)))
@register()
def carousel_horses() -> Shape:
 return loop(4, lambda i: transform_shape(
```

```
library_call('carousel_horse'),
rotation_matrix(i * math.pi / 2, (0, 1, 0),
 \leftrightarrow (0, \overline{0}, 0)) @ translation_matrix((1.5, \leftrightarrow 0, 0))
@register()
def canopy() -> Shape:
 cone = primitive_call('cylinder',

→ shape_kwargs={'radius': 2, 'p0': (0, 3, 0),

→ 'p1': (0, 3.5, 0)}, color=(1, 0.5, 0.5))

top = primitive_call('sphere',

 shape_kwargs={'radius': 0.1}, color=(1,
 → 0.7, 0.7))

top = transform_shape(top,

→ translation_matrix((0, 3.6, 0)))

return concat_shapes(cone, top)
 @register()
def carousel() -> Shape:
 base = library_call('carousel_base')
platform = library_call('carousel_platform')
pole = library_call('carousel_pole')
 horses = library_call('carousel_horses')
canopy_shape = library_call('canopy')
return concat_shapes(base, platform, pole,

→ horses, canopy_shape)

 @register animation()
def carousel_animation() -> Generator[Shape, None,
 → None]:
 total_frames = 60
 for frame in range(total_frames):
 angle = frame * 2 * math.pi / total_frames
 rotated_carousel = transform_shape(
 library_call('carousel'),
 rotation_matrix(angle, (0, 1, 0), (0,
 \leftrightarrow 0, \overline{0})
 vield rotated carousel
This program creates a carousel with a small
 1. `carousel_base`: A cylindrical base for the

carousel_platform: A slightly smaller cylinder
on top of the base.
carousel_pole: A central pole for the
carousel.
carousel_horse: A simple horse shape made from

 the central pole.
 canopy: A small conical canopy with a

→ spherical top.
7. `carousel`: Combines all the components to

 carousel_animation`: An animation that rotates

The carousel is designed with a modular approach,
\hookrightarrow allowing easy modifications and adjustments to \hookrightarrow individual components. The animation function
 rotates the entire carousel, simulating its
 movement.
```

# Example 2. Input: "solar system model". Output:

```
@register()
def planet(radius: float, color: tuple[float,
float, float]) -> Shape:
return primitive_call('sphere',
 def orbit(radius: float) -> Shape:
 points = 100
 orbit_shape = []
for i in range(points):
 angle = 2 * math.pi * i / points
x = radius * math.cos(angle)
z = radius * math.sin(angle)
orbit_point = primitive_call('sphere',
 orbit_shape.append(transform_shape(orbit_p|
 return concat_shapes(*orbit_shape)
@register()
def solar_system() -> Shape:
 venus_orbit = library_call('orbit', radius=2.5)
earth_orbit = library_call('orbit', radius=3.5)
mars_orbit = library_call('orbit', radius=4.5)
 return concat_shapes(
 sun_shape, mercury_orbit,
 venus_orbit,
 earth_orbit,
 mars_orbit
@register_animation()
def solar_system_animation() -> Generator[Shape,
 → None, None]:
 total_frames = 120
 for frame in range(total_frames):
 t = frame / total_frames
 sun = library call('sun')
 \label{eq:mercury} \begin{array}{ll} \texttt{mercury} = \texttt{transform_shape(} \\ \texttt{library_call('planet', radius=0.1,} \\ &\hookrightarrow \texttt{color=(0.7, 0.7, 0.7)),} \\ \texttt{rotation_matrix(t} * 4 * \texttt{math.pi, (0, 1, } \\ &\hookrightarrow \texttt{0), (0, 0, 0))} @ \\ &\hookrightarrow \texttt{translation_matrix((1.5, 0, 0)))} \end{array}
 \label{eq:venus} \begin{array}{lll} \text{venus} &= & \text{transform_shape(} \\ & \text{library_call('planet', radius=0.15,} \\ & \hookrightarrow & \text{color=(0.9, 0.7, 0.4)),} \\ & \text{rotation_matrix(t} * 3 * \text{math.pi, (0, 1,} \\ & \hookrightarrow & \text{0), (0, 0, 0))} @ \\ & \hookrightarrow & \text{translation_matrix((2.5, 0, 0))} \end{array}
 earth = transform_shape(
 → 0), (0, 0, 0)) @

→ translation_matrix((3.5, 0, 0))
 mars = transform_shape(
 \leftrightarrow 1, 0), (0, 0, 0)) @ \leftrightarrow translation_matrix((4.5, 0, 0))
```

```
solar_system = library_call('solar_system')
 yield concat_shapes(solar_system, sun,
 This program creates a simple solar system model \hookrightarrow with the following components:
{f 1.} A sun at the center.
2. Four planets (Mercury, Venus, Earth, and Mars) \hookrightarrow orbiting around the sun.
3. Orbit paths for each planet.
The 'solar system animation' function generates an
 \hookrightarrow animation of the planets orbiting around the
 sun. Each planet moves at a different speed,
\,\hookrightarrow\, simulating their relative orbital periods.
Here's a breakdown of the functions:
- `sun()`: Creates a vellow sphere representing the
- `planet(radius, color)`: Creates a sphere with \hookrightarrow the given radius and color, representing a
\hookrightarrow planet. - `orbit(radius)`: Creates a circular orbit path at
→ the given radius.
- `solar_system()`: Combines the sun and orbit
→ paths into a static solar system model.
- `solar_system_animation()`: Animates the planets
\hookrightarrow orbiting around the sun.
The animation runs for 120 frames, with each planet
\hookrightarrow completing a different fraction of its orbit in \hookrightarrow that time. The sun remains stationary at the

→ center while the planets rotate around it.
```

# Example 3. Input: "a toy wind turbine". Output:

```
Here's a program to create a toy wind turbine using \hookrightarrow the provided 'helper.py':
from helper import *
a toy wind turbine
@register()
def turbine_base() -> Shape:
 return base
@register()
def turbine_nacelle() -> Shape:
 nacelle = primitive_call('cube',

→ shape_kwargs={'scale': (0.6, 0.4, 0.8)},

→ color=(0.7, 0.7, 0.7))
 return transform_shape(nacelle,
 \hookrightarrow translation_matrix((0, 2.2, 0)))
@register()
def turbine_blade() -> Shape:
 blade = primitive_call('cube',

→ shape_kwargs=('scale': (0.1, 1.5, 0.05)},

→ color=(1, 1, 1))

return transform_shape(blade,
 \hookrightarrow translation_matrix((0, 0.75, 0)))
@register()
def turbine_rotor() -> Shape:
 return loop(3, lambda i: transform_shape(
 library_call('turbine_blade'),
rotation_matrix(i * 2 * math.pi / 3, (0, 0,

→ 1), (0, 0, 0))
))
@register()
def wind_turbine() -> Shape:
```

```
base = library_call('turbine_base')
 nacelle = library_call('turbine_nacelle')
 rotor = transform_shape(library_call('turbine_))

 rotor'), translation_matrix((0, 2.2,
 0.4)))
 return concat_shapes(base, nacelle, rotor)
def wind_turbine_animation() -> Generator[Shape,
→ None, None]:
 total_frames = 60
 for frame in range(total_frames):
 angle = frame * 2 * math.pi / total_frames
 base = library_call('turbine_base')
 nacelle = library_call('turbine_nacelle')
rotor = transform_shape(
 library_call('turbine_rotor'),
 rotation_matrix(angle, (0, 0, 1), (0,

→ 2.2, 0.4)) @ translation_matrix((0,

→ 2.2, 0.4))
 yield concat_shapes(base, nacelle, rotor)
This program creates a toy wind turbine with the

→ following components:
1. 'turbine base': A cylindrical base for the
 turbine.
turbine.turbine_nacelle: A cuboid representing the

 → nacelle (housing) at the top of the turbine.
 3. `turbine_blade`: A single blade of the turbine.
 4. `turbine_rotor`: Three blades arranged in a

The `wind_turbine_animation` function creates an
→ animation of the turbine with rotating blades.

→ It generates 60 frames, rotating the rotor by a
 full 360 degrees over the course of the
```

animation.