

CAD-Assistant: Tool-Augmented VLLMs as Generic CAD Task Solvers

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https://cadassistant.github.io/

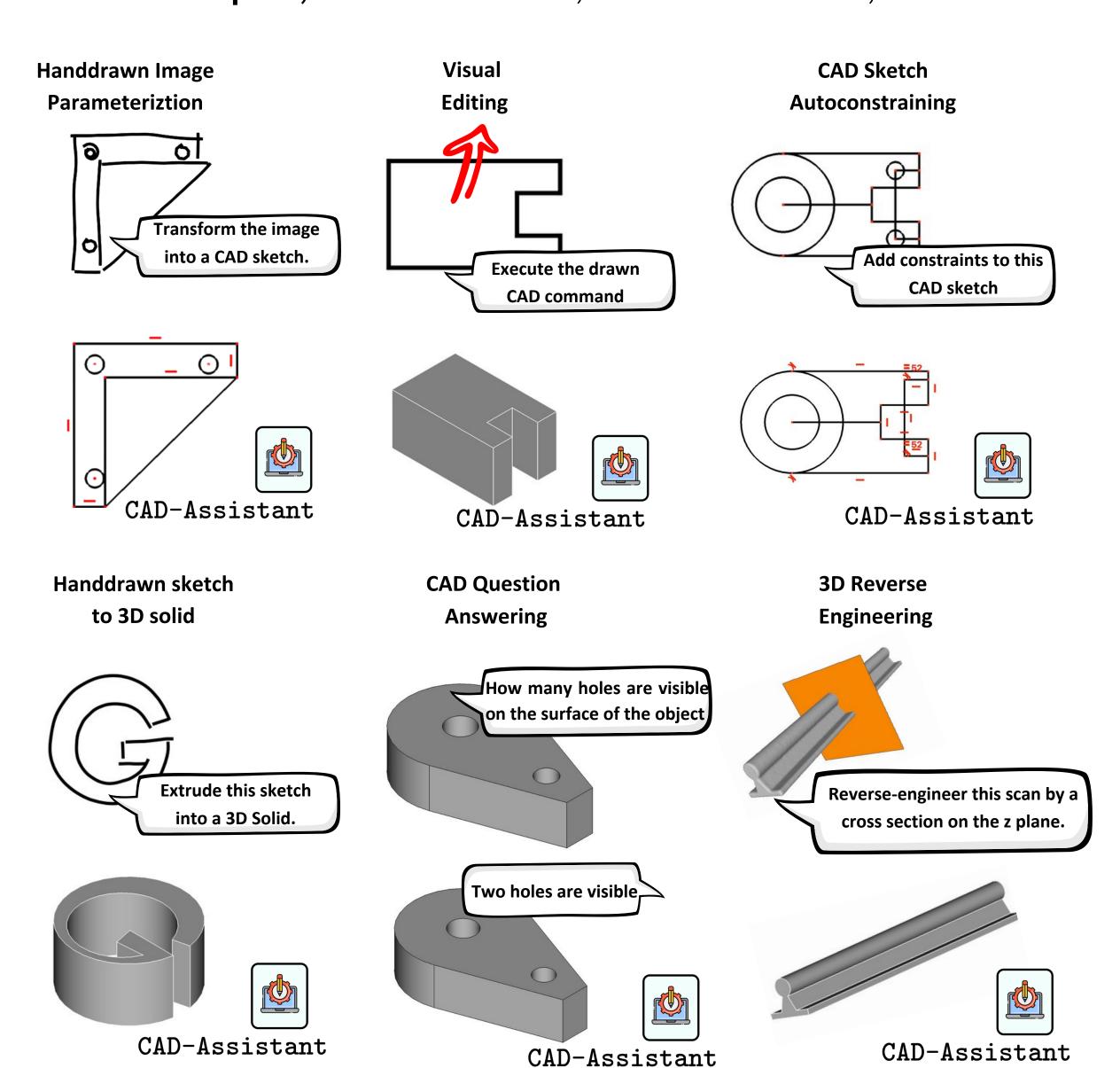




Introduction

CAD-Assistant is a tool-augmented VLLM framework for CAD.

Our method integrates FreeCAD and can processes text and multimodal inputs, such as sketches, drawn commands, and 3D scans.

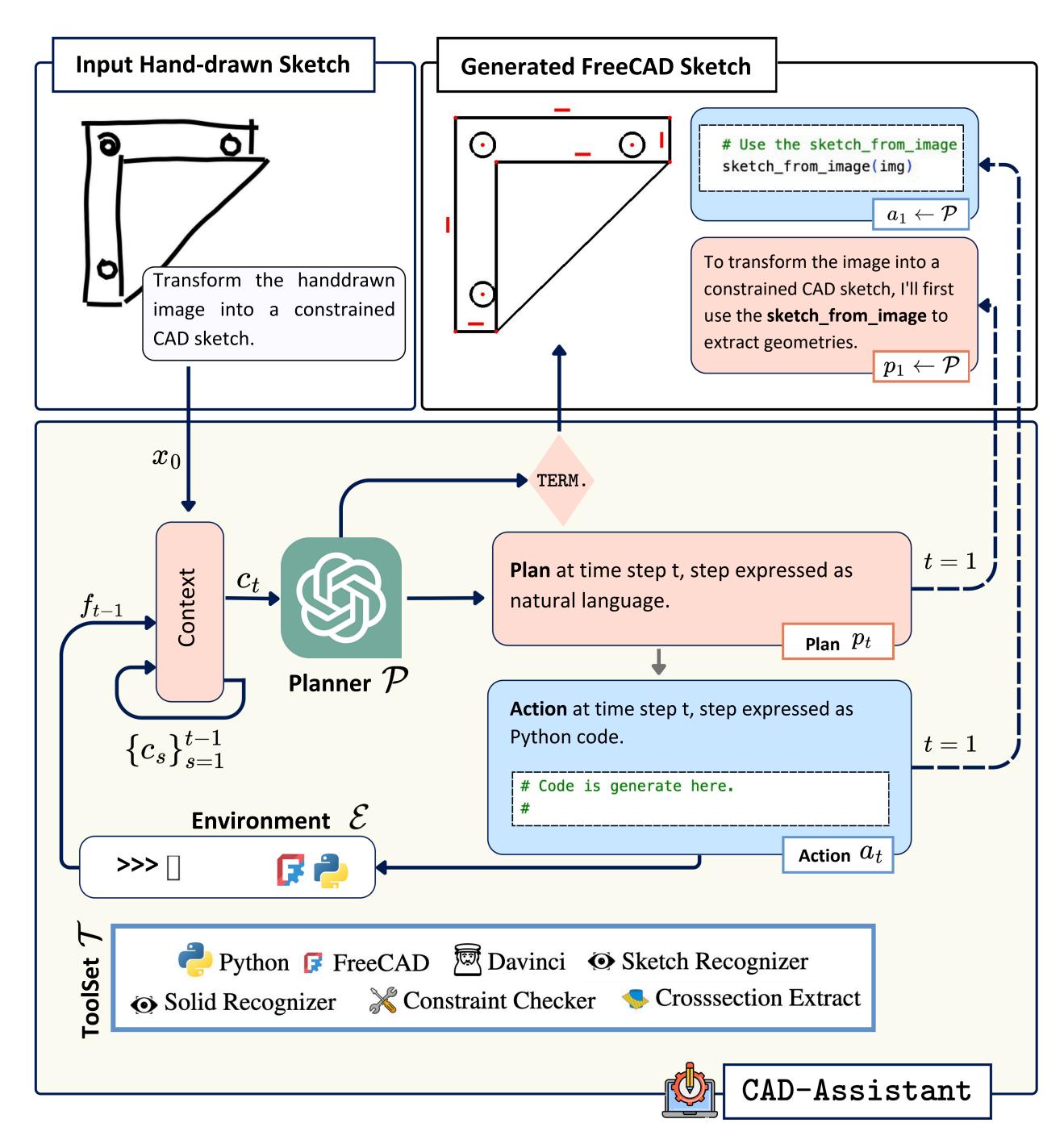


This figure showcases various examples of generic CAD queries and the responses generated by CAD-Assistant.

Contributions:

- First tool-augmented framework for generic CAD tasks.
- **Enhanced geometric reasoning** via CAD software integration.
- Training-free and highly extensible framework.
- **Zero-shot method** outperforming task specific baselines.
- Demonstrated potential on diverse real-world use cases.

Method



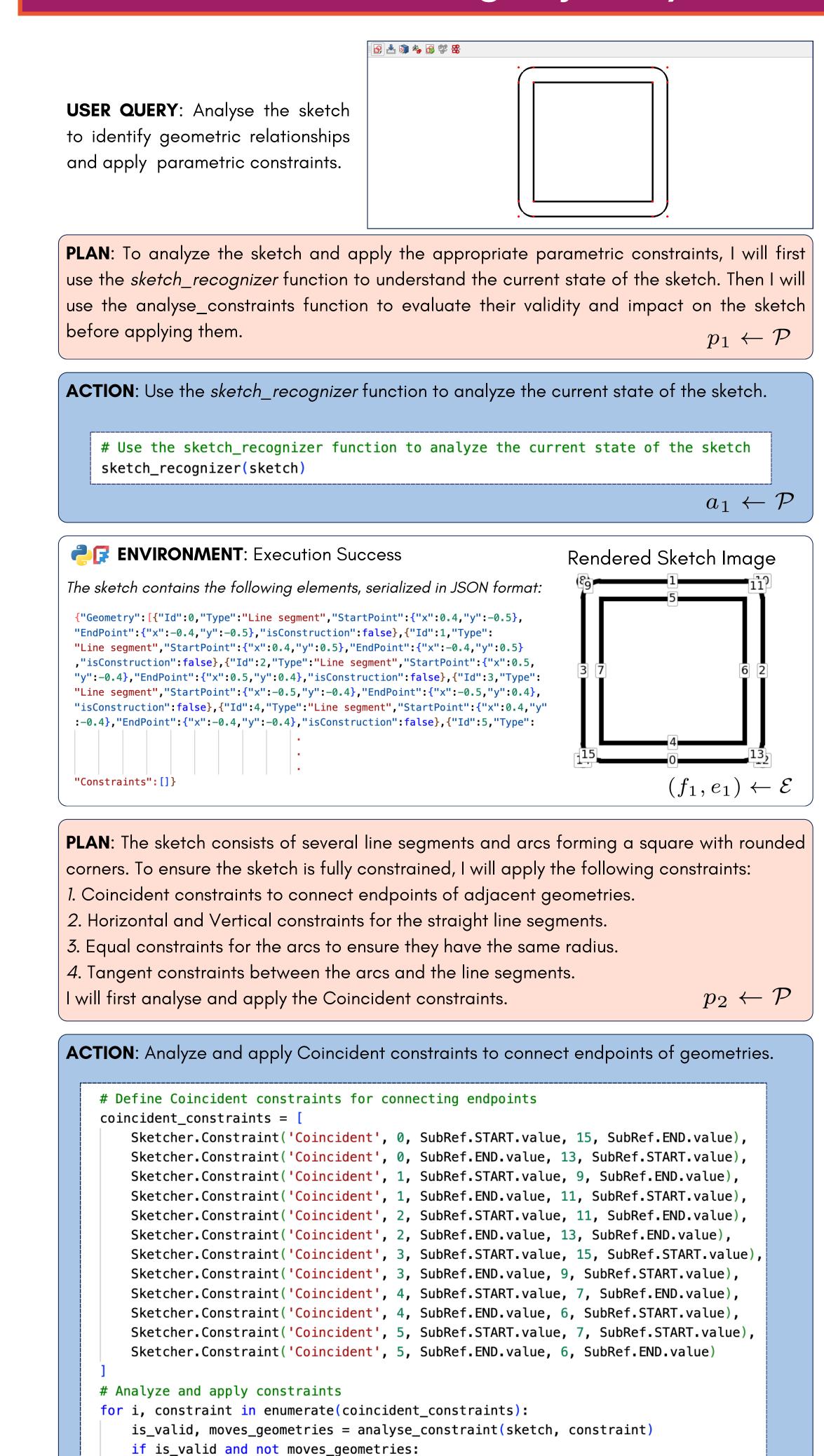
Overview of CAD-Assistant framework.

- **A multimodal user request** is provided to a VLLM planner.
- The planner has access to a Python environment equipped with

CAD software and CAD specific tools.

- The planner analyses the context and generates plan and action. <u>Action</u> is executed on the CAD environment.
- The environment **provides feedback** on the current design state.
- Process completes with the generation of the TERMINATE plan.

Autoconstraining Trajectory



Tool Use for Effective Geometric Reasoning

VLLMs have shown limited ability to geometrically comprehend CAD programs. We examine CAD representations that can be derived using tools and improve geometric reasoning.

Parametrization Strategy: Geometries can be represented by different parameter sets. We compare the implicit parametrization to the point-based and over-parametrization.

Serialization Strategy: We compare commonly used formats such as CSV, Markdown, HTML, and JSON.

Rendering-based Reasoning: We provide the VLLM planner with 2D renderings of the CAD sketch or 3D solid.

Serialization	Parametarization	2D Acc	
Common CAD Sketch formats			
Serialized Graph	Implicit	0.674	
DXF		0.671	
OCA		0.707	
Serialization Strate	egy (Tabular formats)		
CSV	Point-based	0.703	
Markdown	Point-based	0.706	
HTML	Point-based	0.710	
Serialization Strate	egy (Schema-embedded formats)		
Serialized Graph	Point-based	0.744	
JSON	Point-based	0.748	
JSON	Overparametarized	0.747	

CAD Sketch Image Type	
Hand-drawn Sketch	0.616
Precise Rendering	0.754

We propose CAD-Assistant, a generic tool-augmented CAD

Evaluation on CAD Benchmarks

The CAD-Assistant can solve a wide range of tasks. We propose a CAD agent evaluation setting based on the following tasks:

- **CAD Question Answering:** Answering open-ended questions about a CAD sketches and 3D CAD models.
- Autoconstraining: Automatically inferring and applying parametric constraints to primitives in a CAD sketch.
- Mand-drawn Sketch Parameterization: Converting a hand-drawn sketch image into a parametric CAD sketch.

CAD Question Answering

Method	Planner	2DAcc	3D Acc
	GPT-4 mini	0.594	0.737
SGPBench [1]	GPT-4 Turbo	0.674	0.762
	GPT-4o	0.686	0.782
	GPT-4 mini	0.614	0.783
CAD-ASSISTANT	GPT-4 Turbo	0.741	0.825
	GPT-4o	0.791	0.857

CAD Sketch Autoconstraining

Method	Type	<i>PF1</i> ↑	<i>CF1</i> ↑
GPT-4o	zero-shot	0.693	0.274
Vitruvion [2]	supervised	0.706	0.238
CAD-ASSISTANT	zero-shot	0.979	0.484

Hand-drawn Sketch Image Parametrization

Method	$Acc\uparrow$	$CD\downarrow$
Vitruvion [2]	0.659	1.586
Davinci [3]	0.789	1.184
CAD-ASSISTANT	0.784	0.680

The CAD-Assistant is a zero-shot method that outperforms baselines and task-specific approaches trained on large datasets.

CAD Tools

FreeCAD **Python**

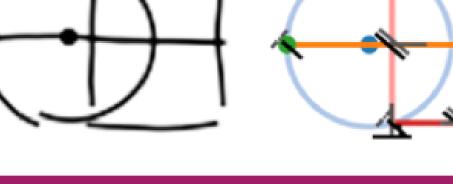








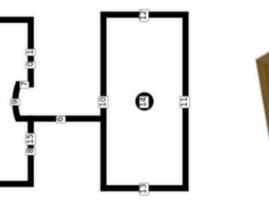






Sketch Parameterizer





CAD sketch and

CAD Model renderers

CAD Recognizers





ConstraintCheck

analysis routine













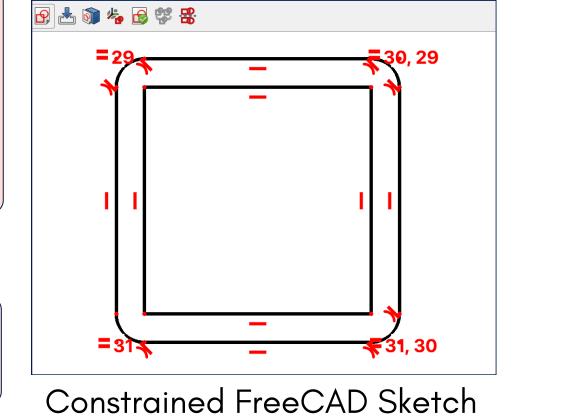
Crosssections ensuring that the loops are closed. Next, I will apply Horizontal and Vertical constraints to the (Rest of the steps) PLAN: The sketch is now properly constrained TERMINATE.

$e_2 \leftarrow \mathcal{E}$ PLAN: The Coincidents have been applied,

 $p_3 \leftarrow \mathcal{P}$

sketch.addConstraint(constraint)

ENVIRONMENT: Execution Success



agent using CAD-specific tools. We outperform task-specific methods and demonstrate the potential of tool-augmented VLLMs in real-world CAD workflows.

 $a_2 \leftarrow \mathcal{P}$

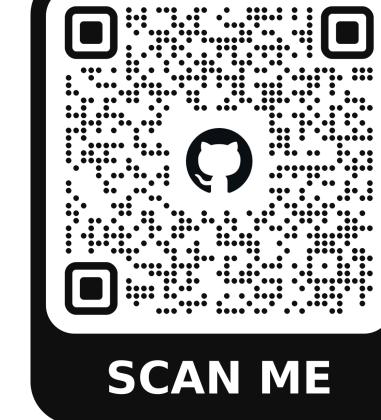
[1] Qiu, et al. "Can Large Language Models Understand Symbolic Graphics Programs?" ICLR (2025) [2] Seff et al. "Vitruvion: A Generative Model of Parametric CAD Sketches." ICLR (2022)

Conclusions

[3] Karadeniz et al. "DAVINCI: A Single-Stage Architecture for Constrained CAD Sketch Inference." BMVC (2024)



Artec 3D



Github

