

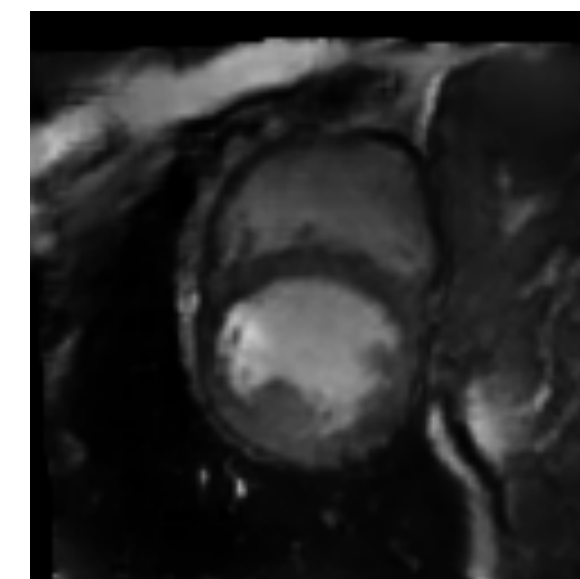
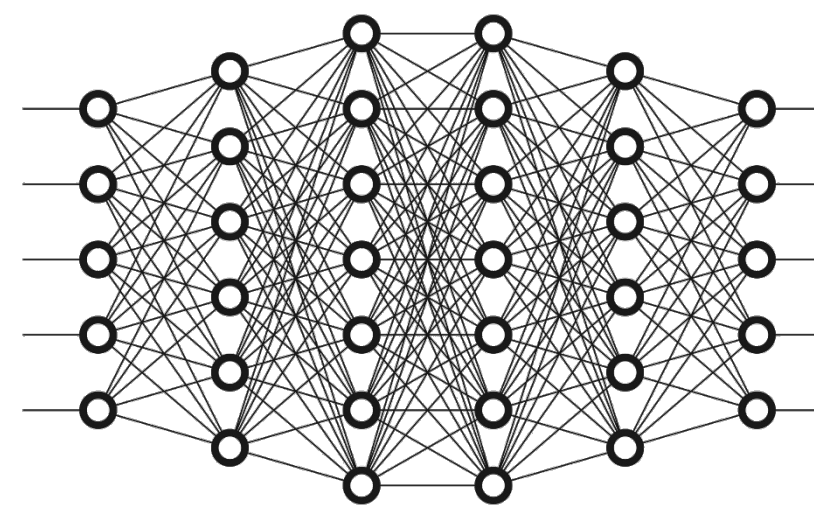
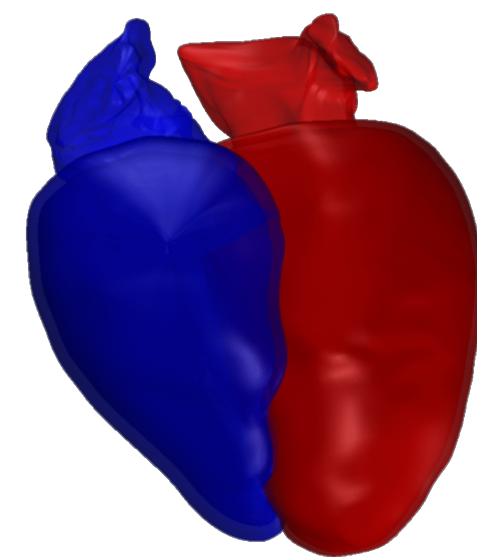
# 4D Semantic Cardiac Magnetic Resonance Image Synthesis on XCAT Anatomical Model

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# Motivation

Expensive data acquisition

Rare properly annotated data

Subjective annotations

Restrictive sharing policy

Physic-based image simulation  
&  
Data-driven image synthesis

To augment the data

To develop new algorithms

To improve domain  
generalization and adaptation

To validate and benchmark

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# Limitations in Image Synthesis

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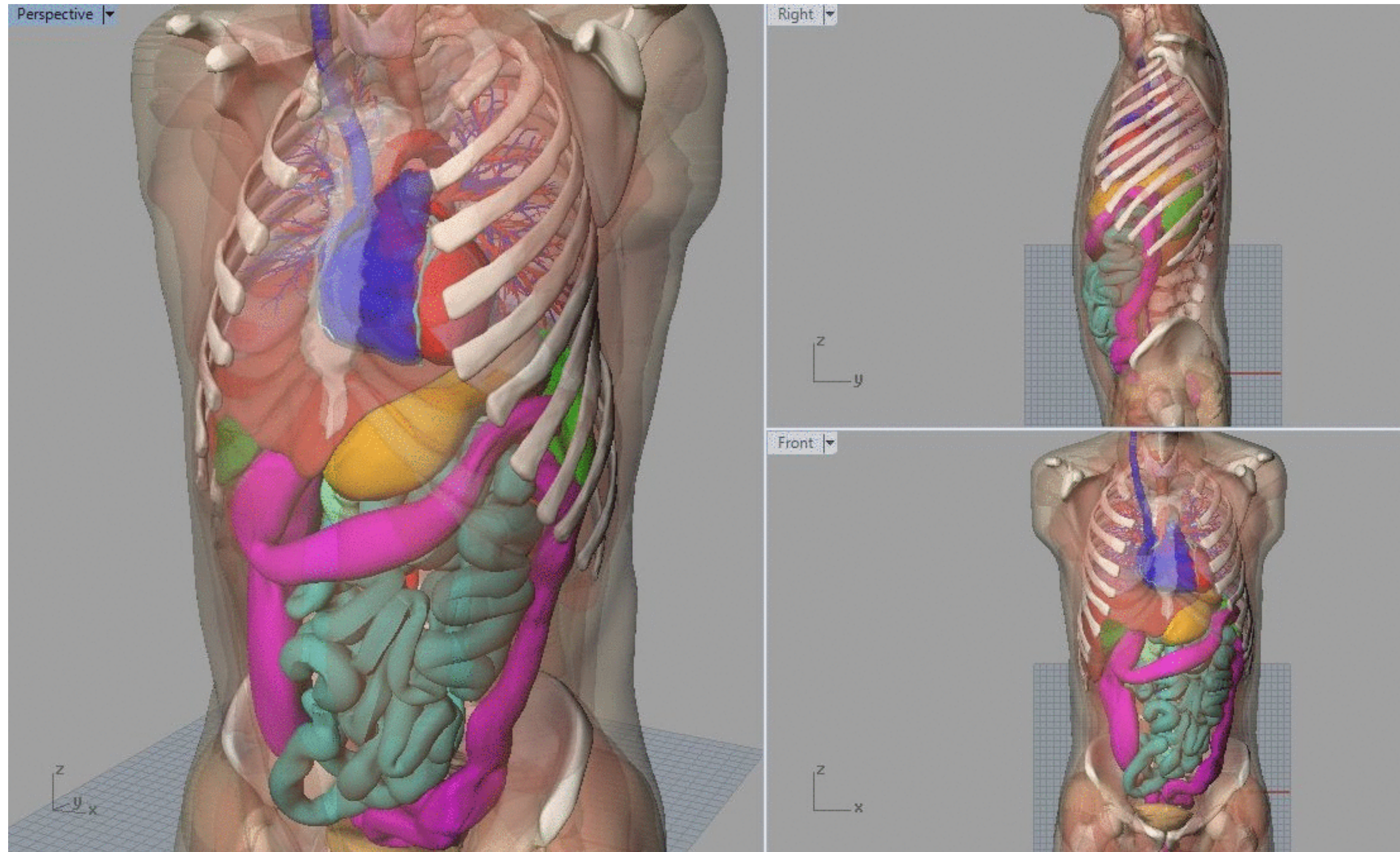
Anatomically and  
physiologically plausible  
images

High dimensional data  
reflecting motion and  
volumetric changes

Controlling anatomical  
content and style



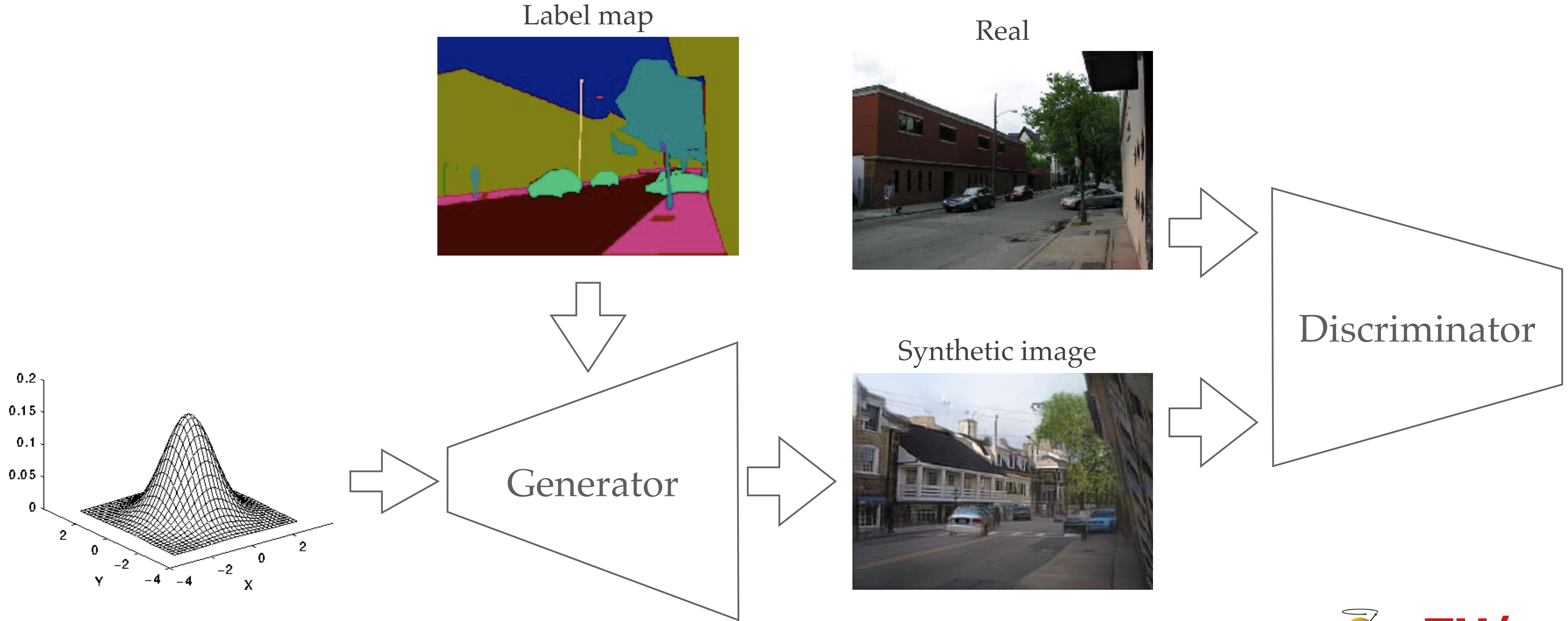
# XCAT: eXtended Cardiac and Torso computerized human phantom



- ❖ Controllable 4D voxelized heart model:
  - ❖ scaling factors in 3D
  - ❖ orientation & translation
  - ❖ cardiac cycle timing
  - ❖ etc.

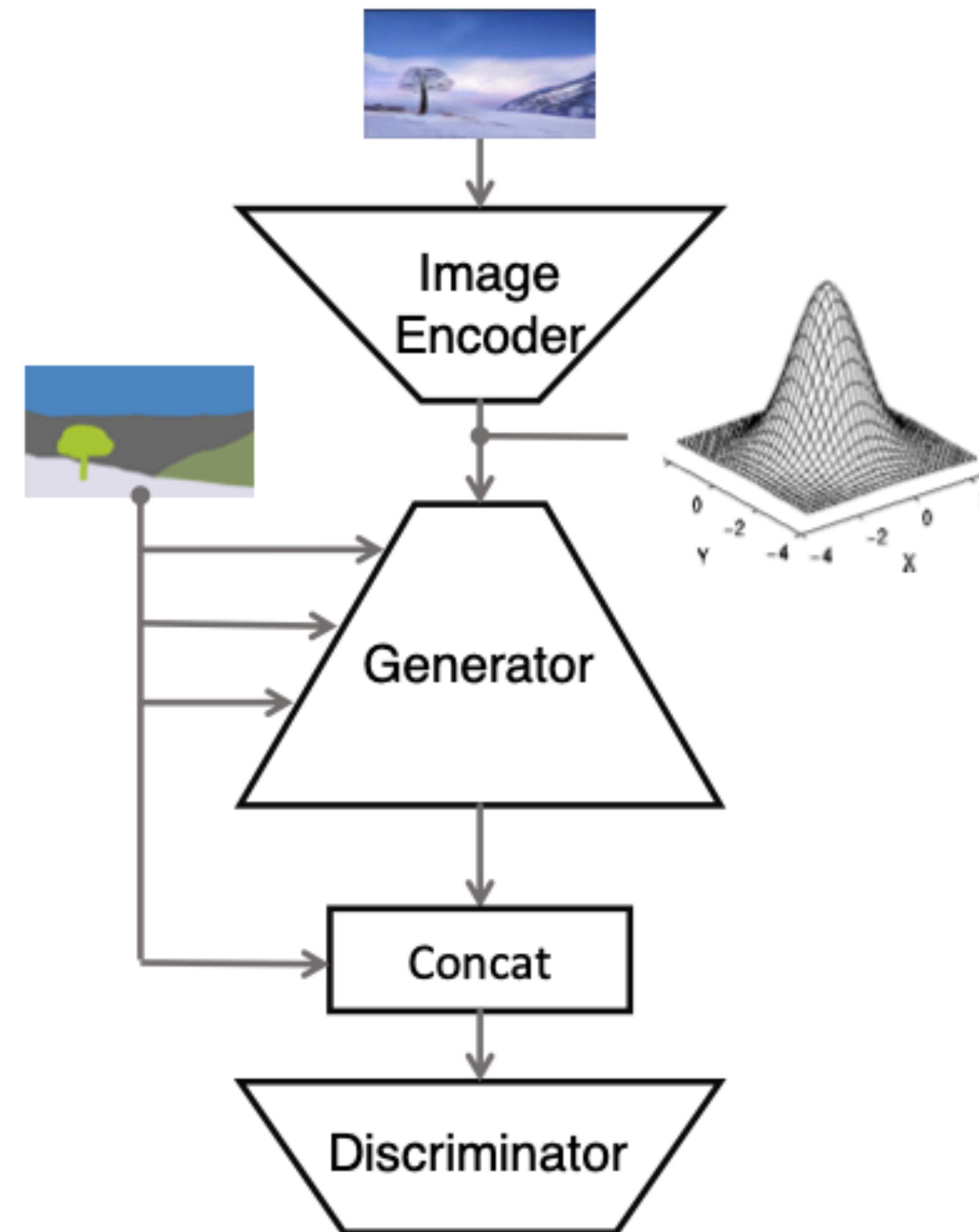
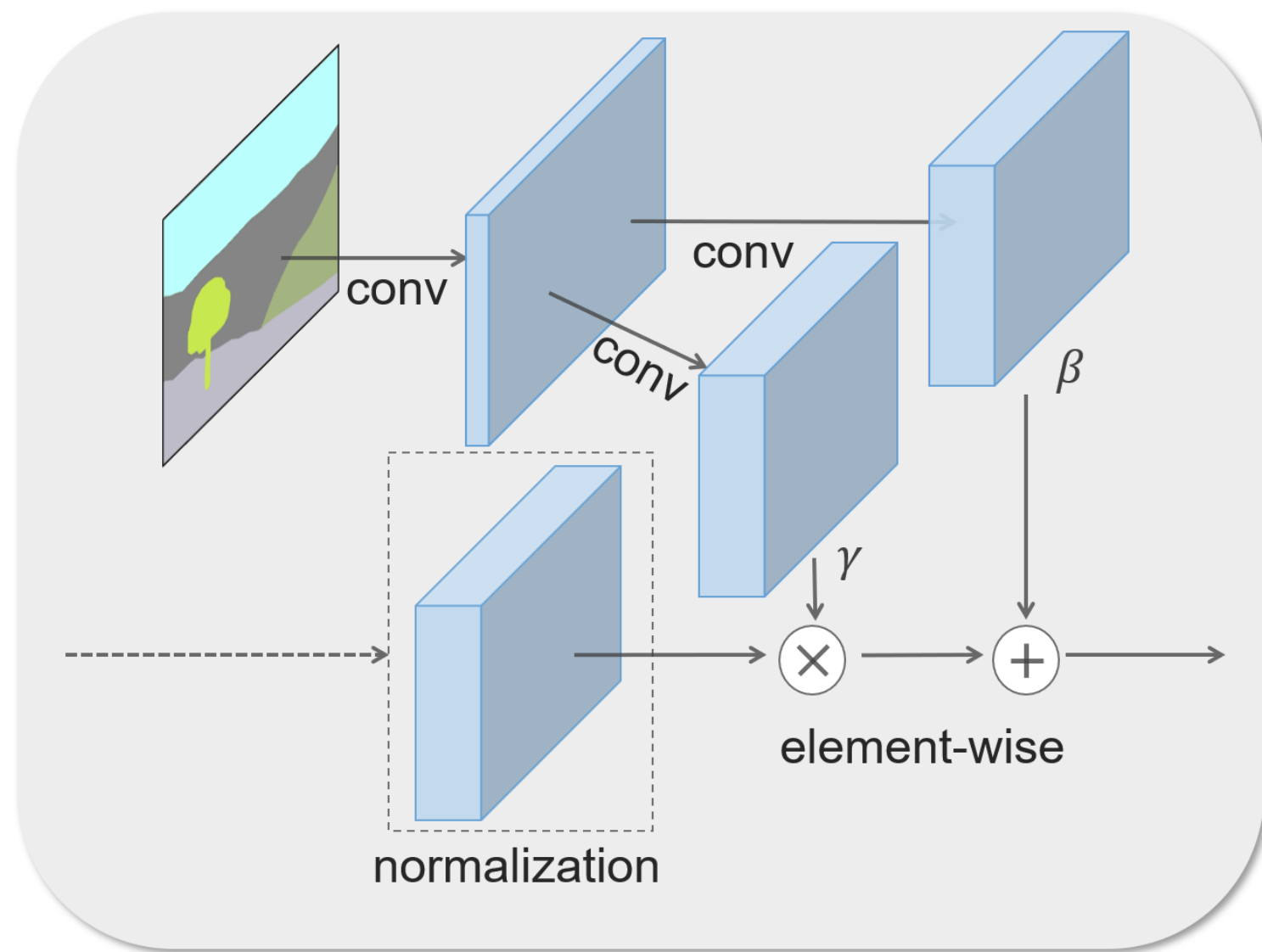


# Conditional Image Synthesis

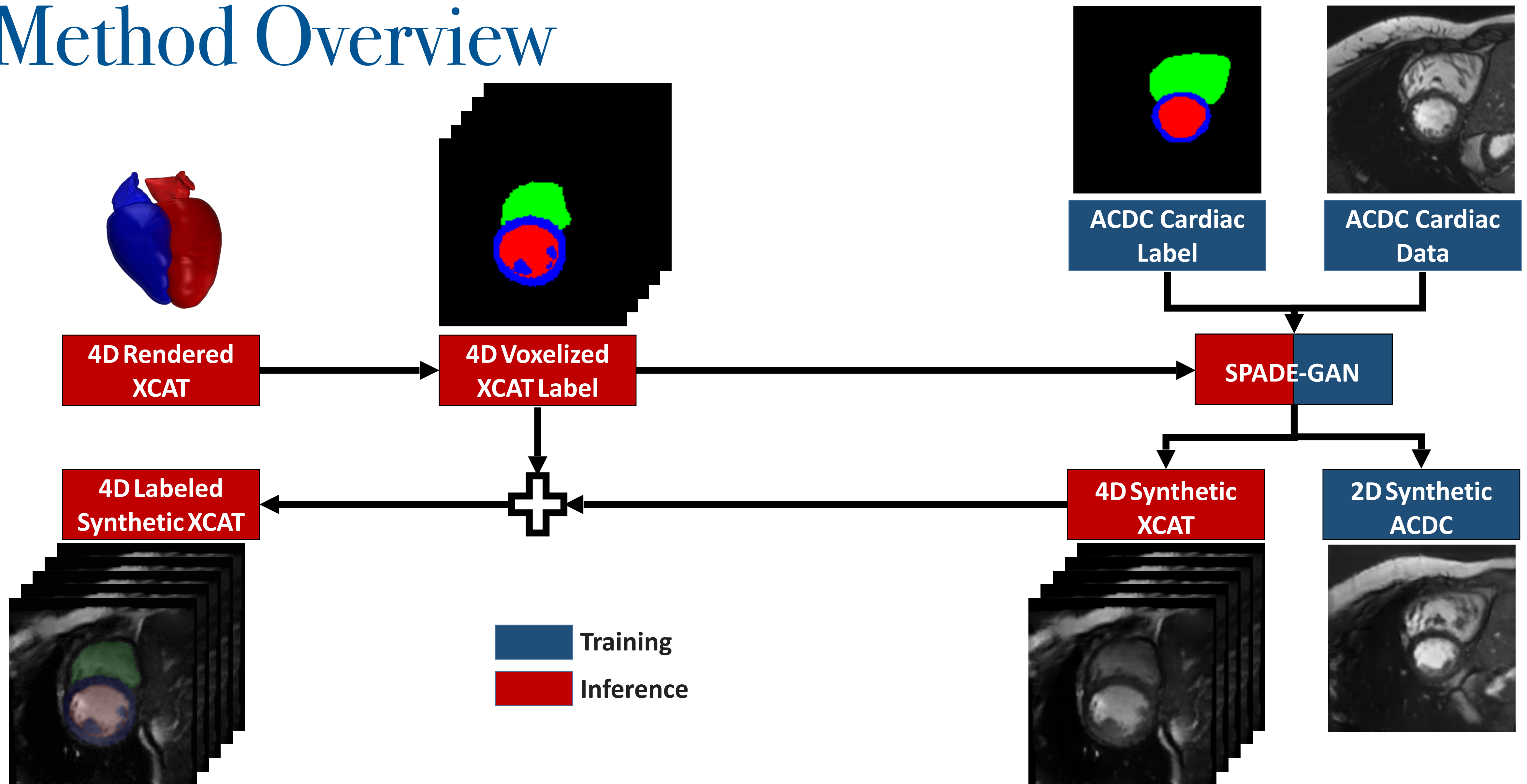


# Conditional Image Synthesis

SPADE: SPatially-Adaptive (DE)normalization

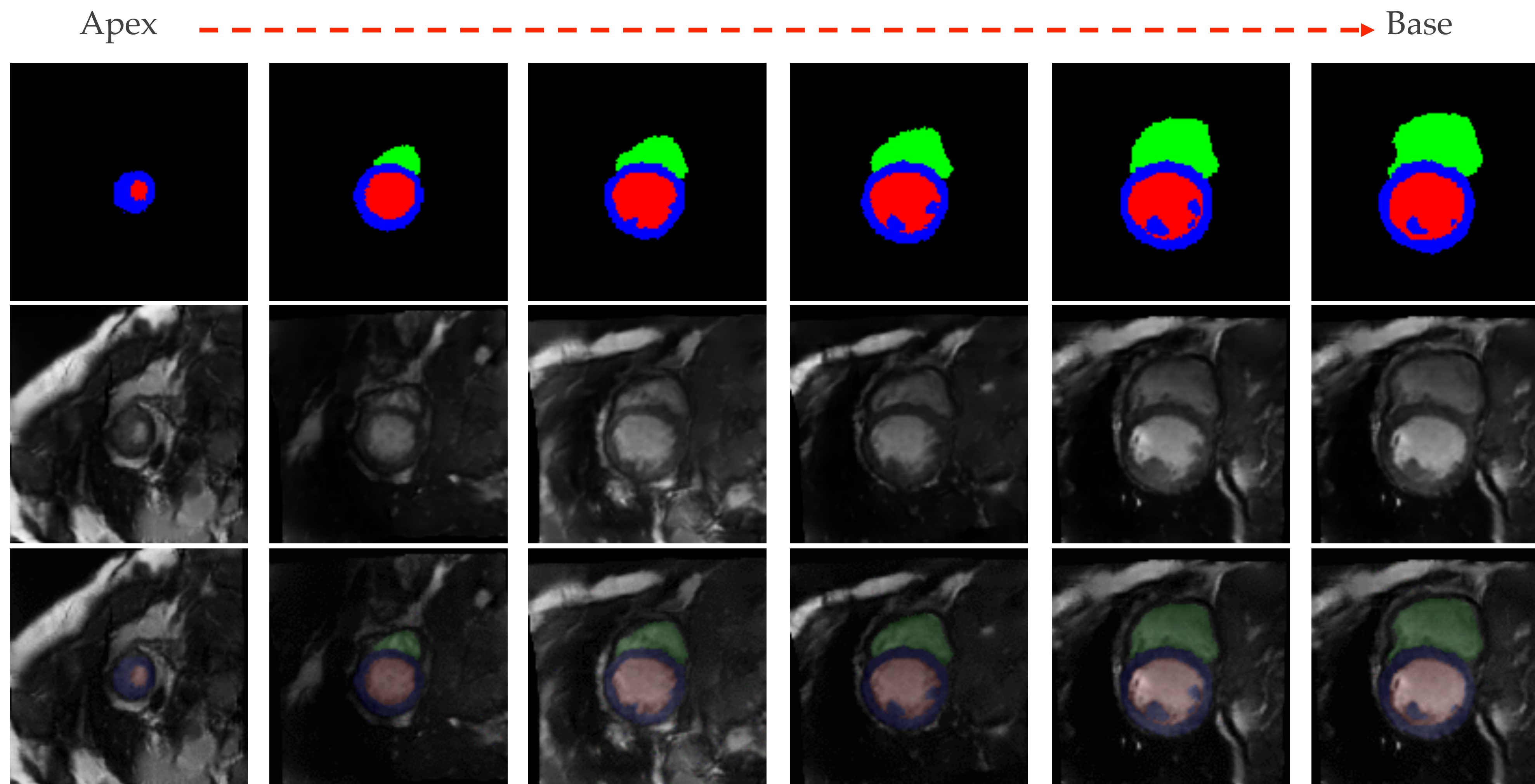


# Method Overview





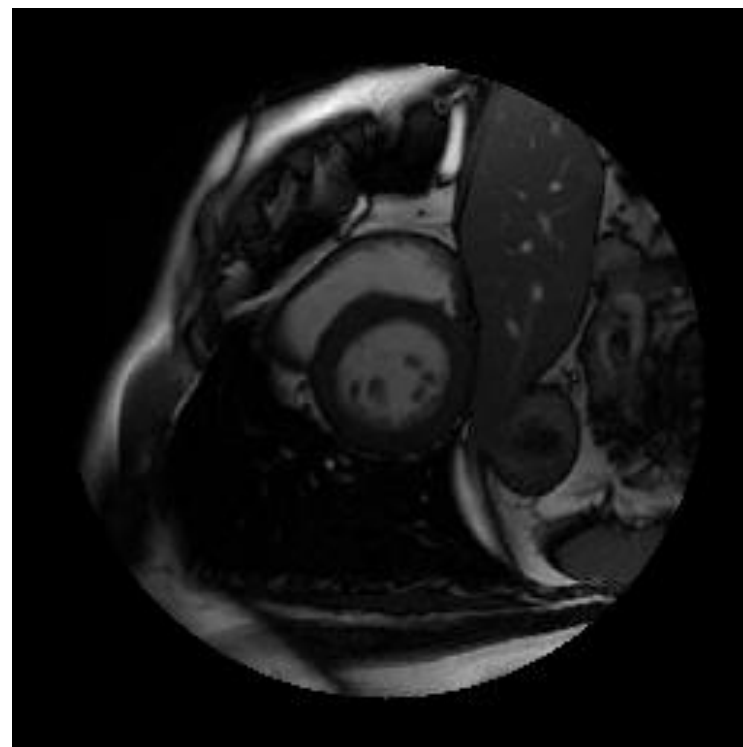
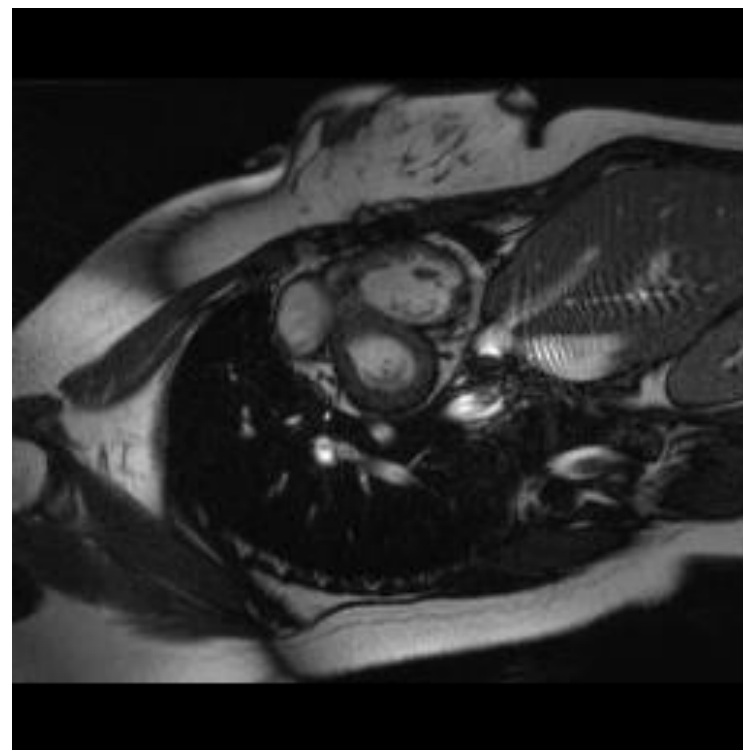
# 3D+t Image Synthesis: 25 time frames for 18 slice locations





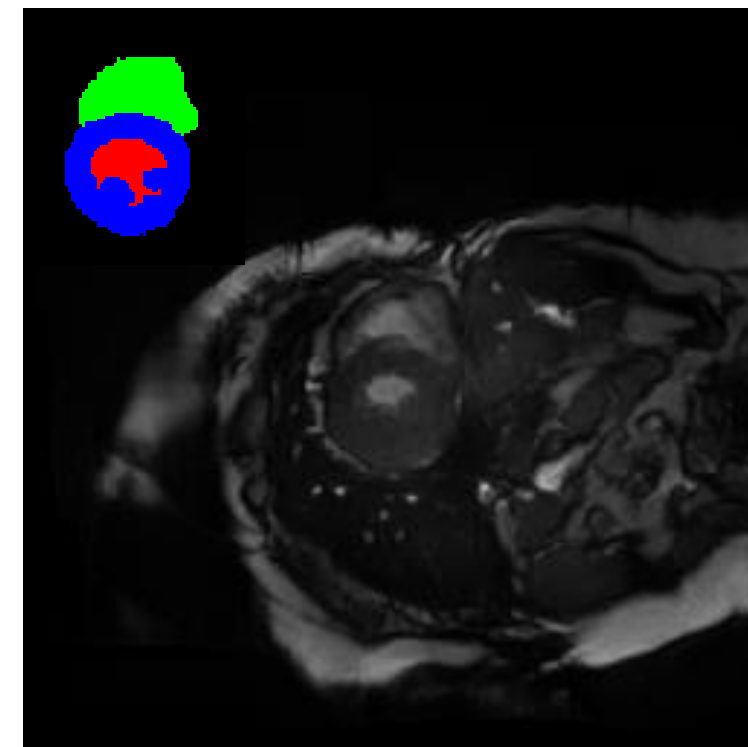
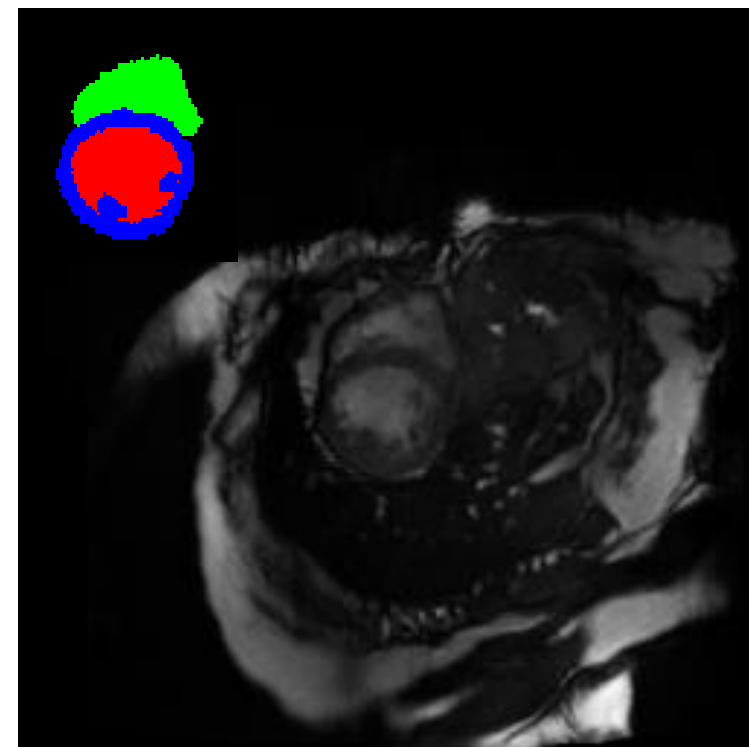
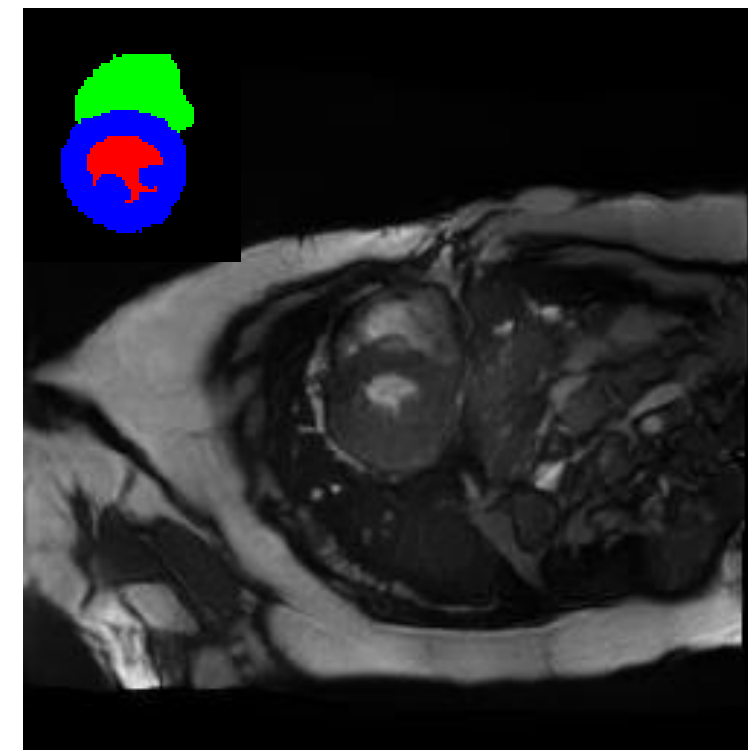
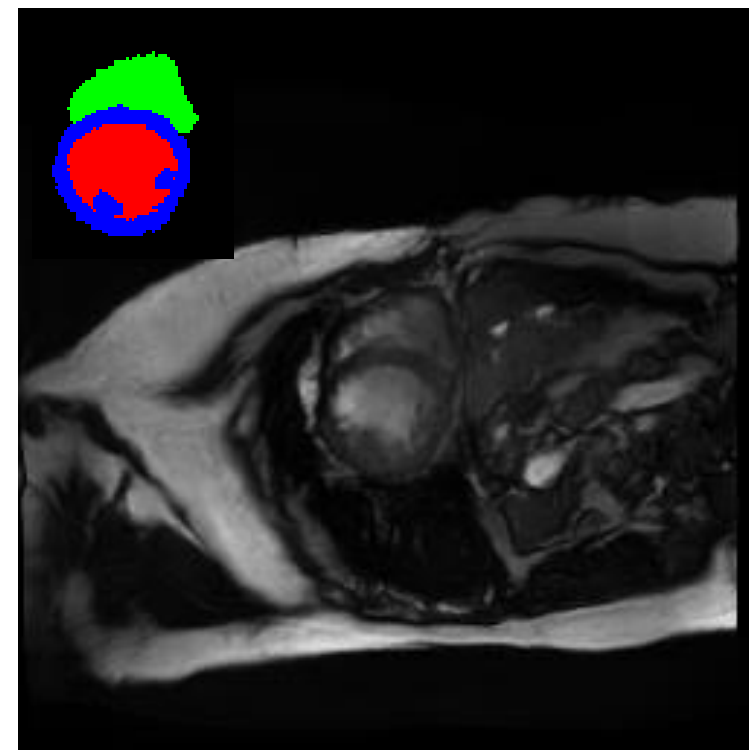
# Stylized 4D labeled Synthetic Dataset

Style Image

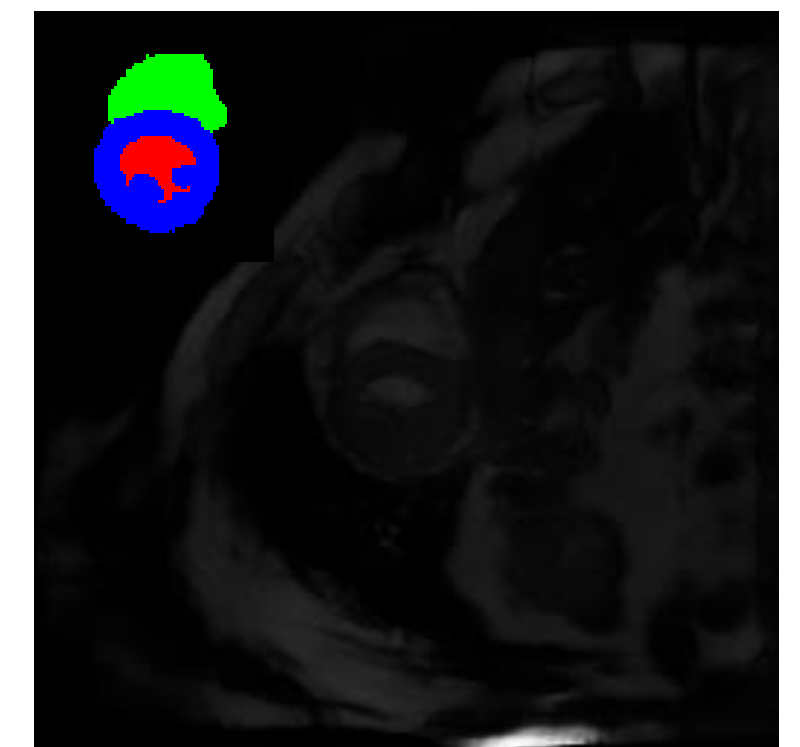
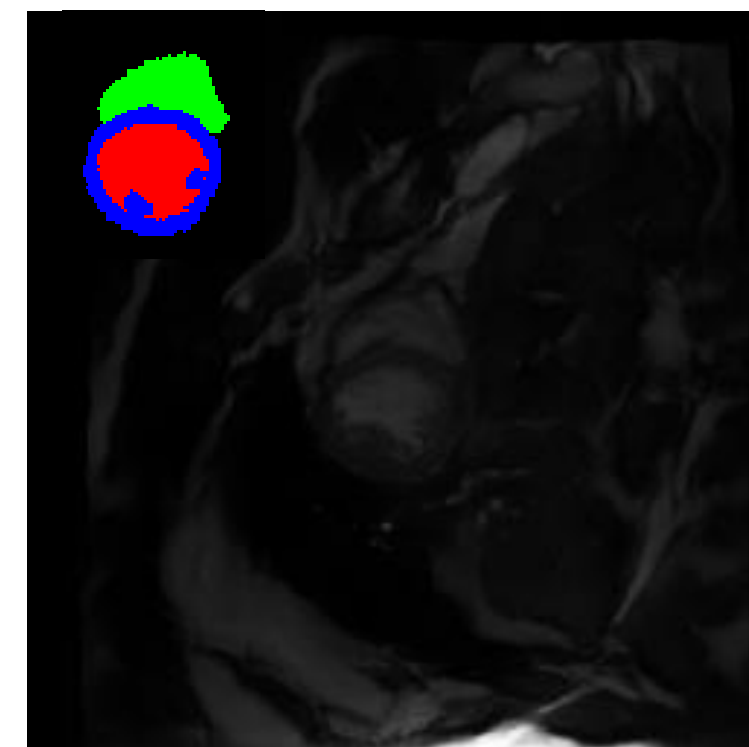
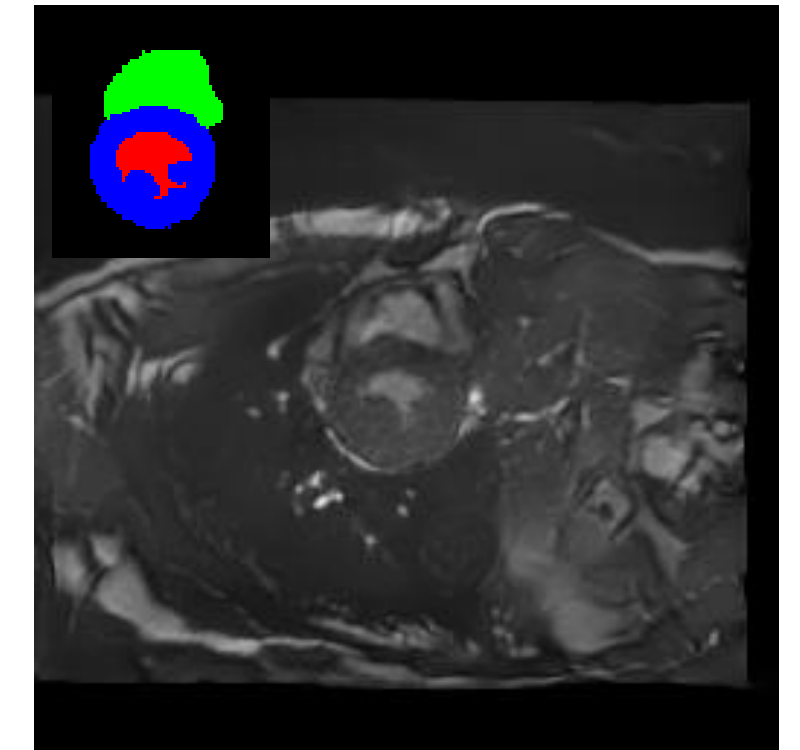
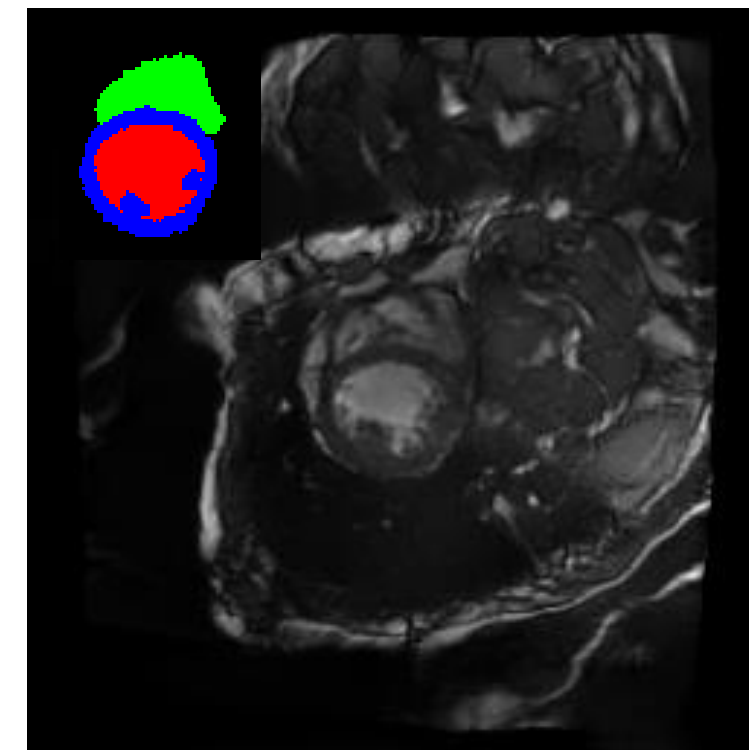


Synthetic images

w/o IN



w/ IN



# Summary

- ❖ 4D labeled cardiac synthetic MR images
- ❖ Wide range of anatomical and style variations
- ❖ Inconsistencies in the background
- ❖ Future work:
  - ❖ Improving image synthesis
  - ❖ Quantitative evaluation
  - ❖ Generating a large virtual population
- ❖ MICCAI2020:
  - ❖ *XCAT-GAN for Synthesizing 3D Consistent Labeled Cardiac MR Images on Anatomically Variable XCAT Phantoms*

