

Spatio-Temporal Graph Representation of Cardiac Dynamics

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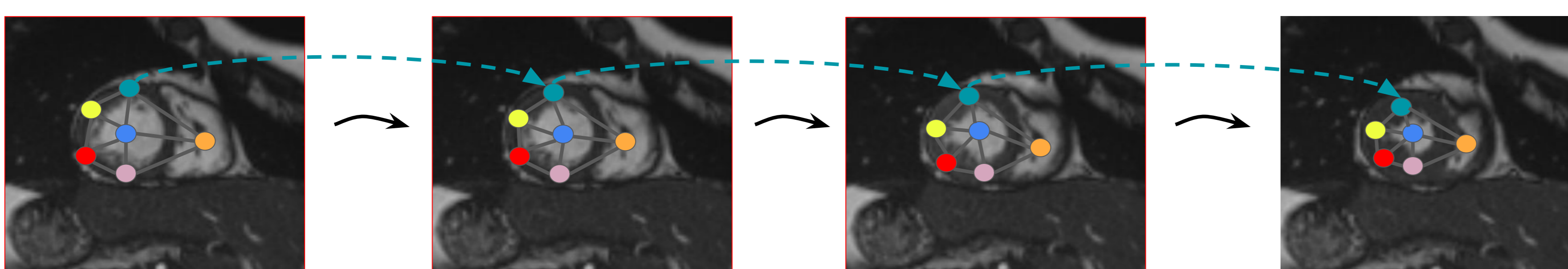
BACKGROUND

Motivation: Cardiovascular diseases (CVDs) are the leading cause of mortality globally. Understanding the spatio-temporal dynamics of the heart is crucial for better diagnosis and treatment.

Problem: Traditional approaches struggle to capture both spatial and temporal cardiac patterns.

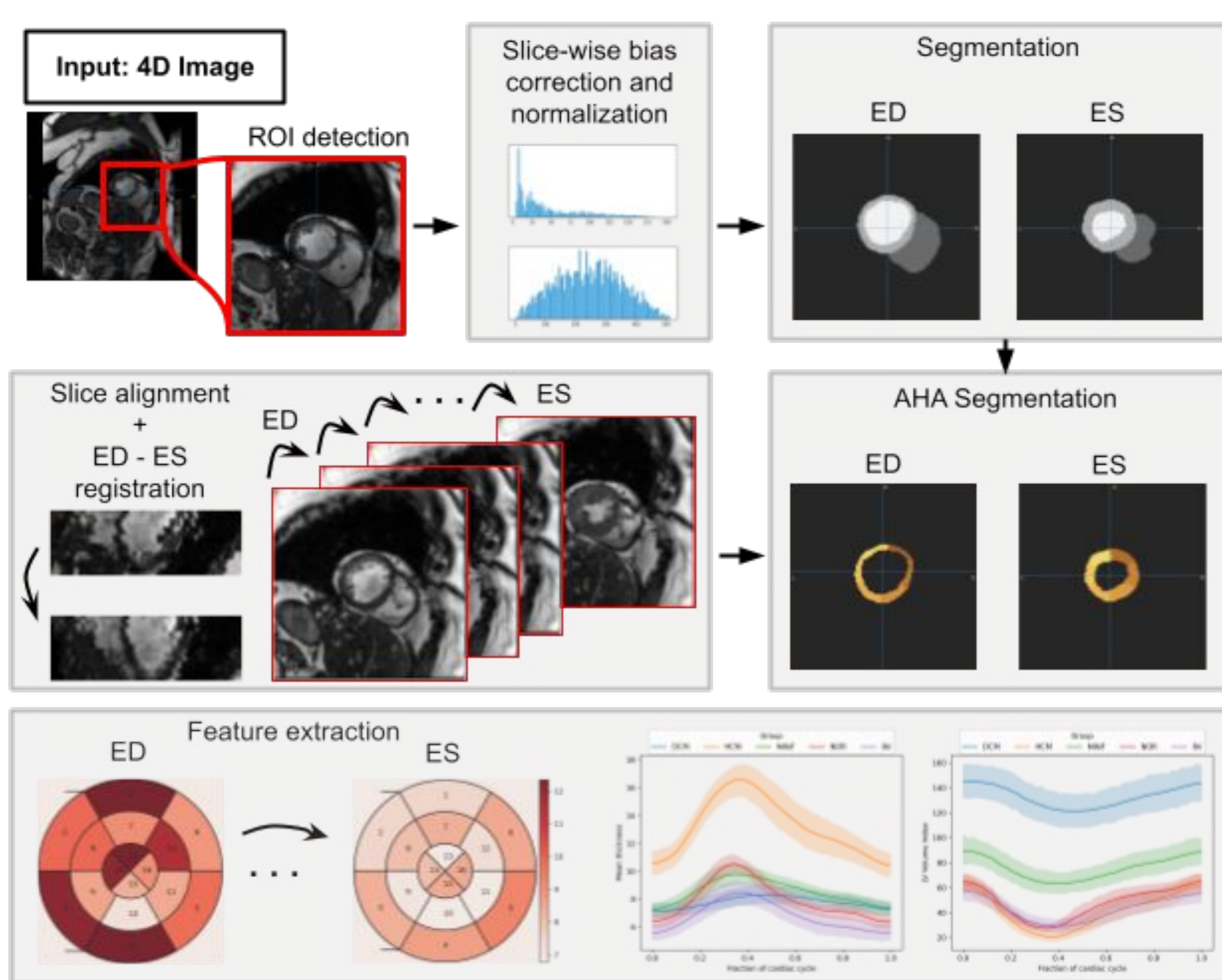
AIMS

1. Represent the heart as a spatio-temporal graph for a comprehensive spatio-temporal representation to capture complex dynamics.



2. Obtain a low-dimensional representation that can:
- Reconstruct cardiac trajectories
 - Offer interpretability in a clinical context
 - Support classification of different cardiac conditions

METHODS

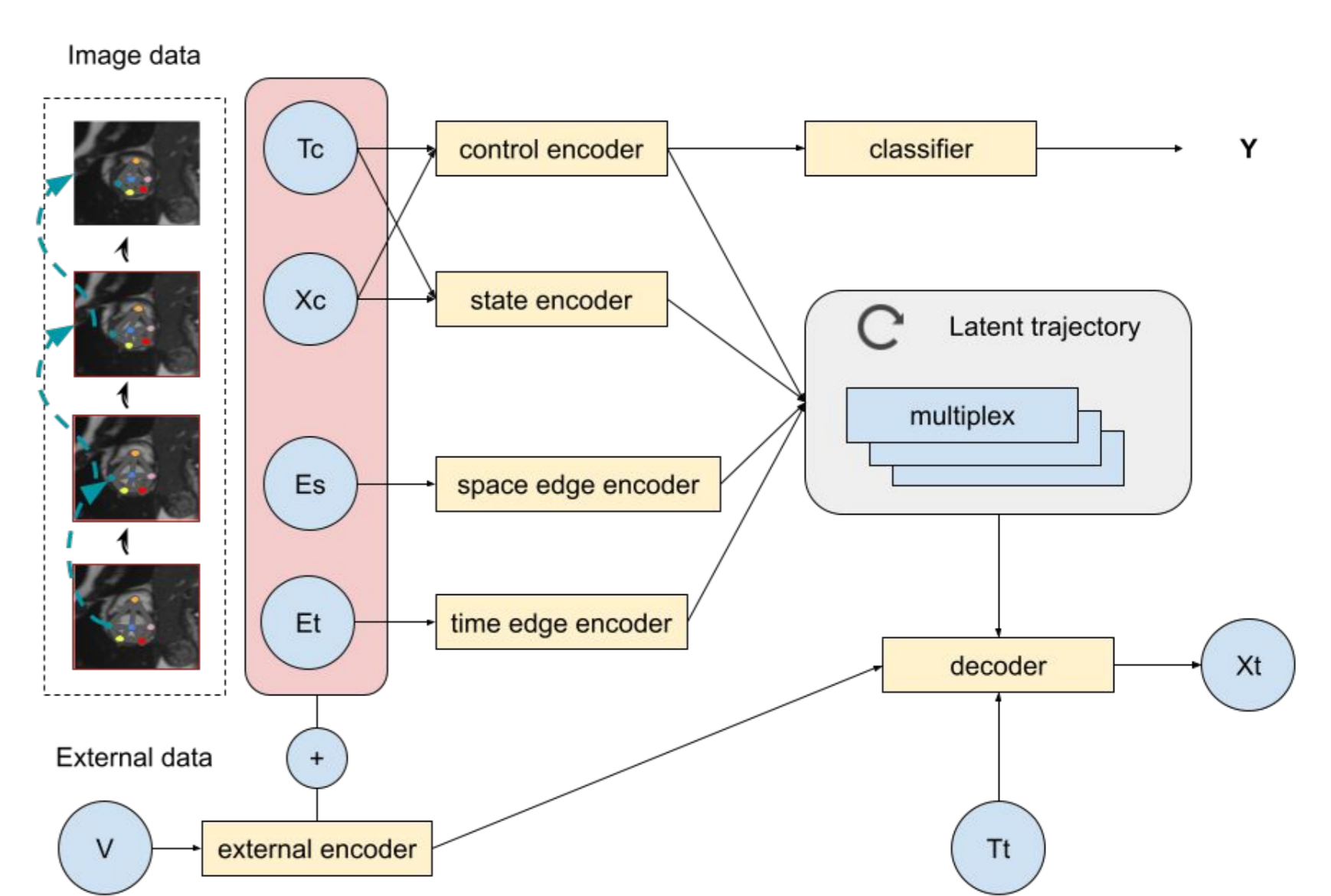
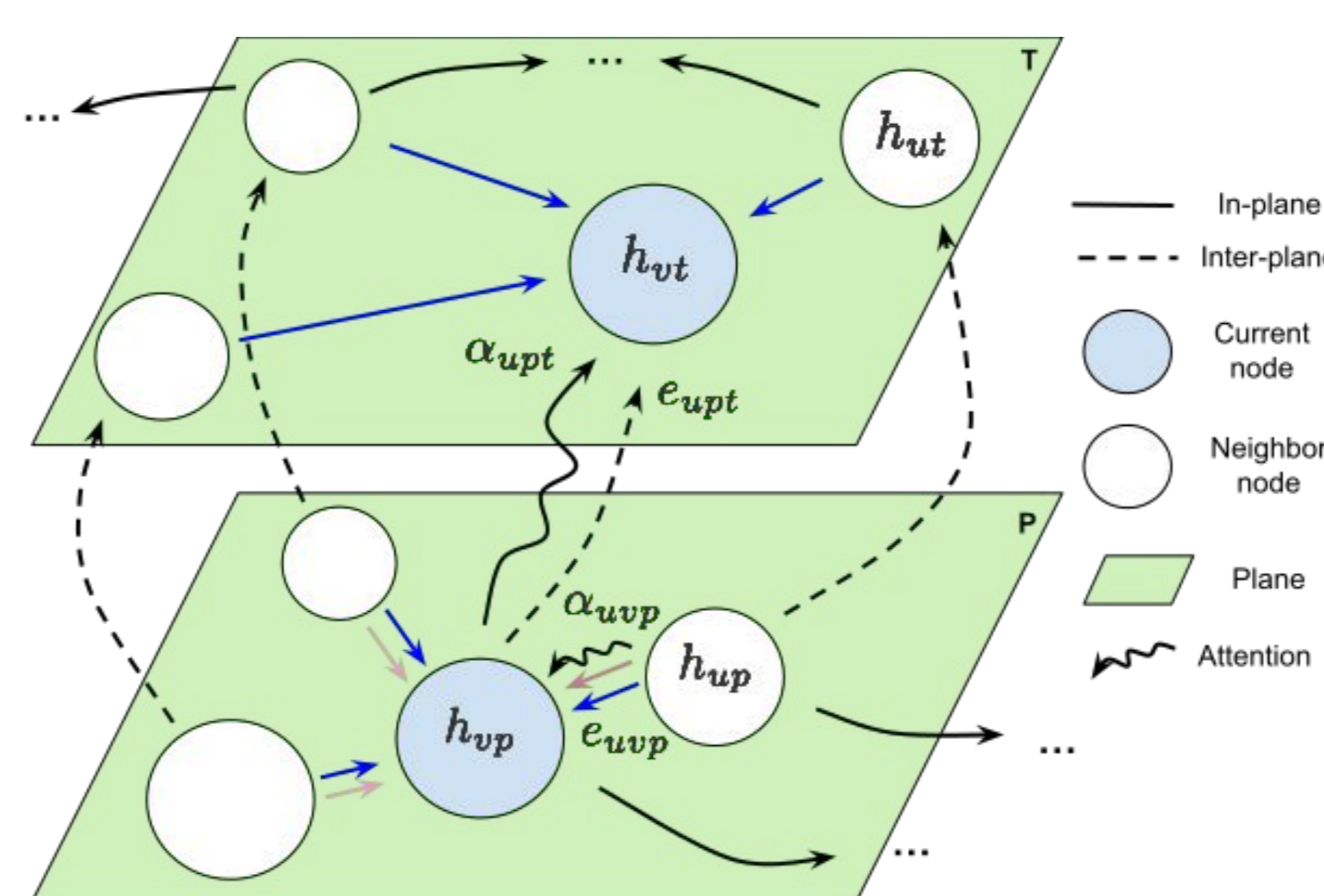


Data processing

Utilized the publicly available ACDC (Automated Cardiac Diagnosis Challenge) dataset. Provides images of 150 subjects evenly distributed in 5 different conditions.

Modelling

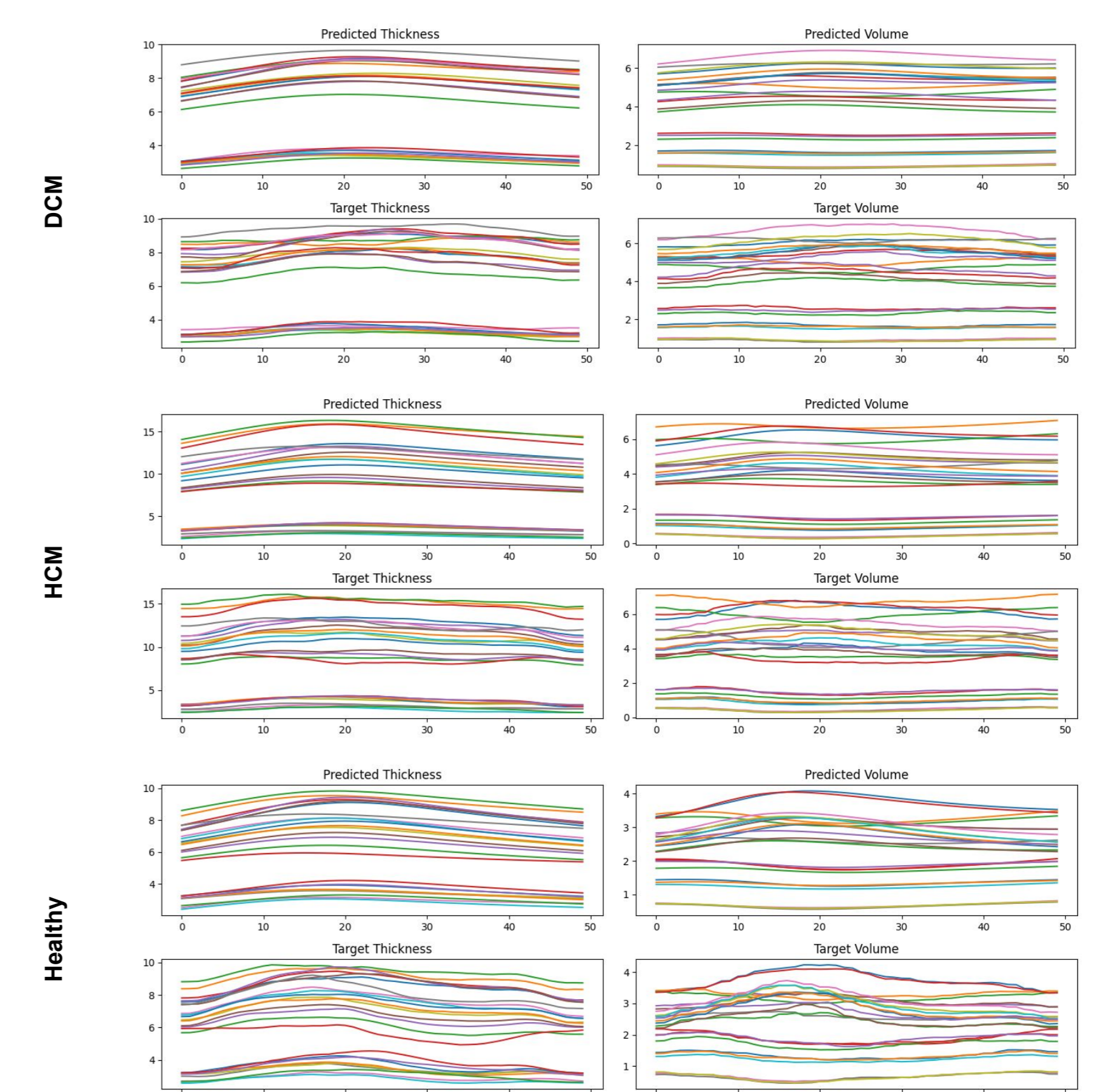
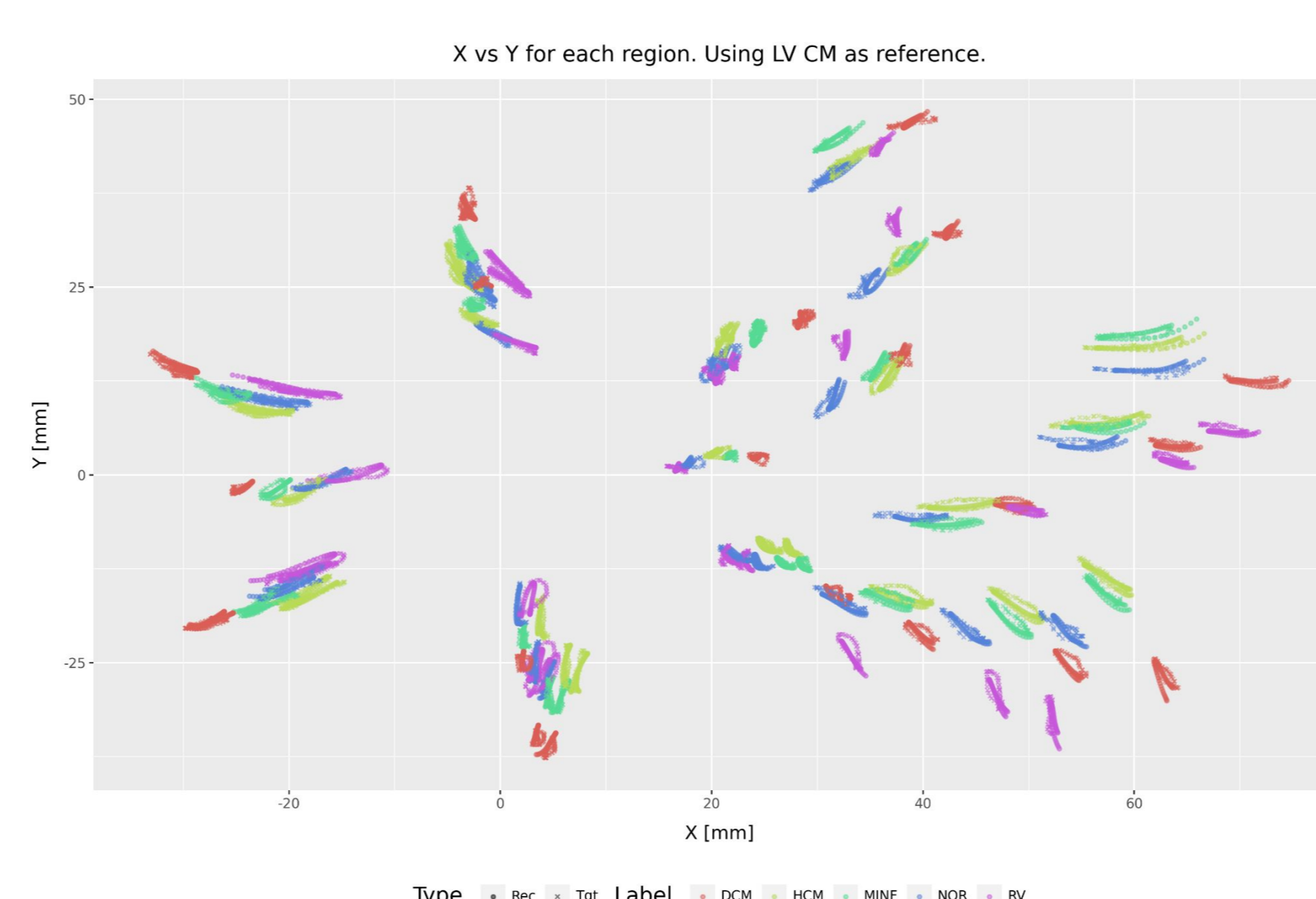
Use Graph Neural Networks (GNN) to model spatio-temporal relationships. Leverage latent ODEs (Ordinary Differential Equations) to model temporal dynamics.



Trained the model to optimize both reconstruction and classification tasks.

- Accurate reconstruction of thickness, volume and movement trajectories
- Differential movement patterns for each heart condition
- Latent features associated with specific cardiac dynamics, i.e: thickness and strain (deformation) of different cardiac regions.

RESULTS



CONCLUSION

Conclusion: The proposed model captures both spatial and temporal dynamics enabling trajectory reconstruction and classification.

Implications: Provides a potential tool for aiding in diagnosis and monitoring by representing heart dynamics in a lower-dimensional space.