

# Dynamic Region-biased Rapidly-exploring Random Trees

by

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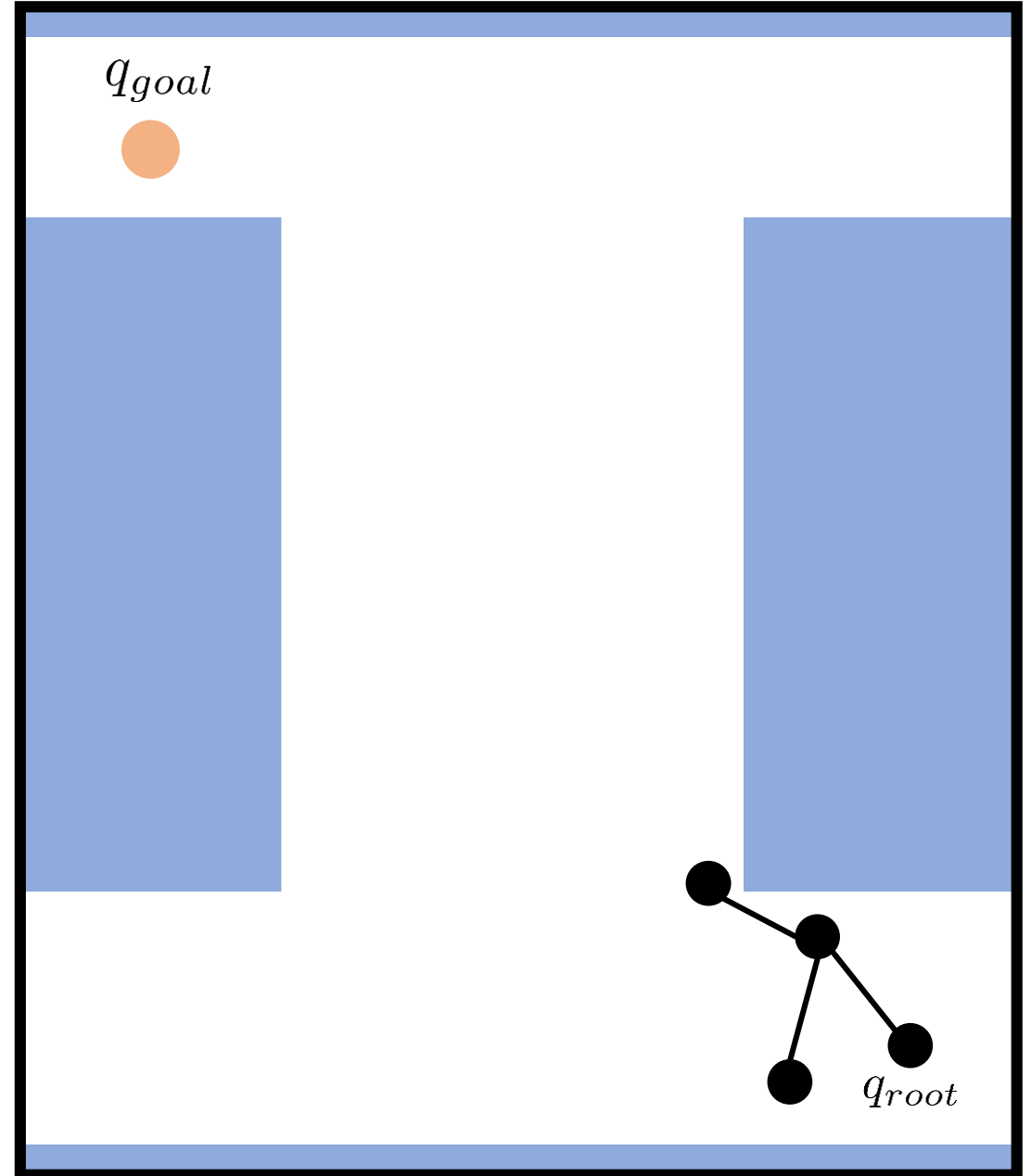
# RRT Review

# RRT Review

- RRT - Randomized Sampling

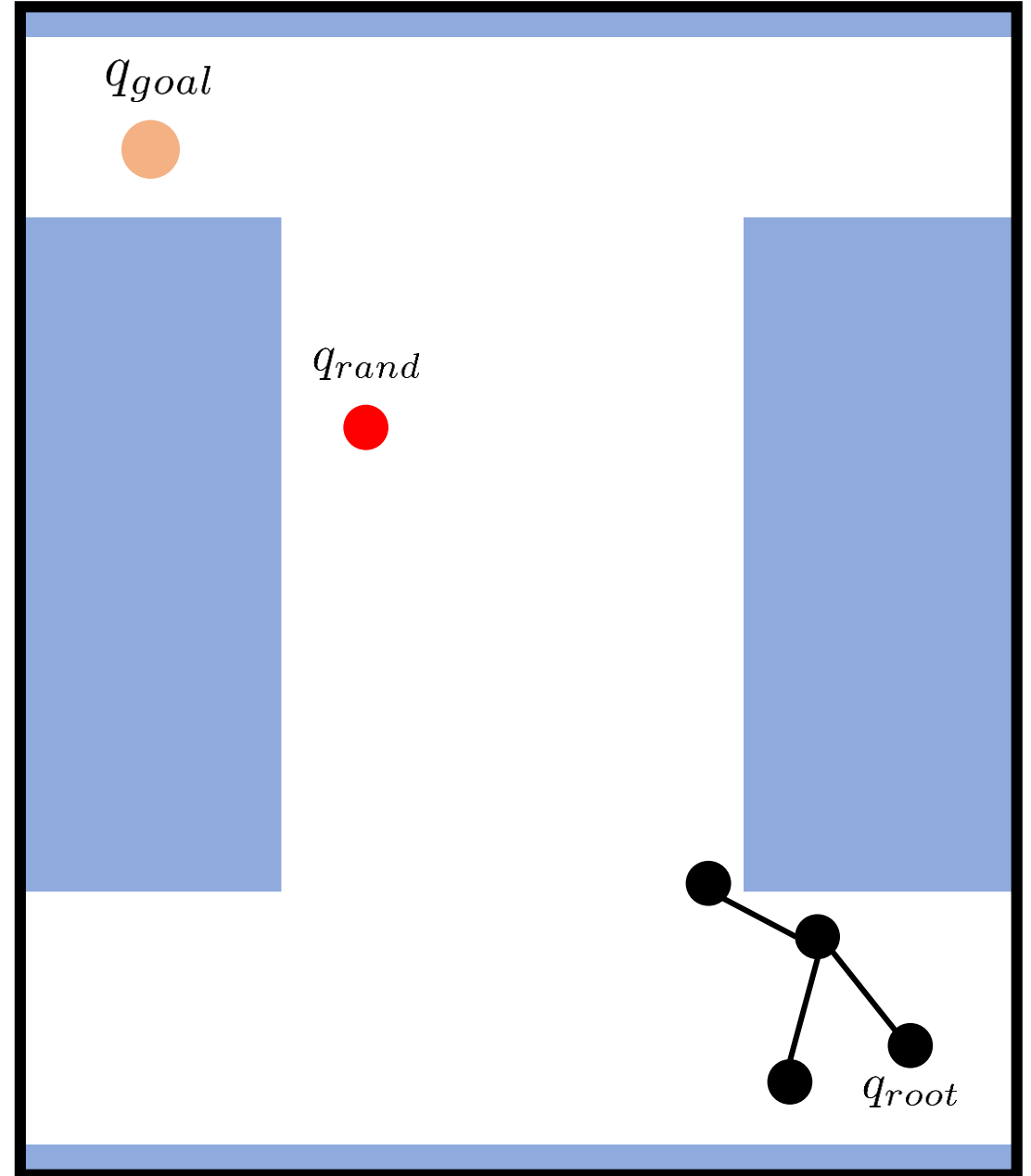
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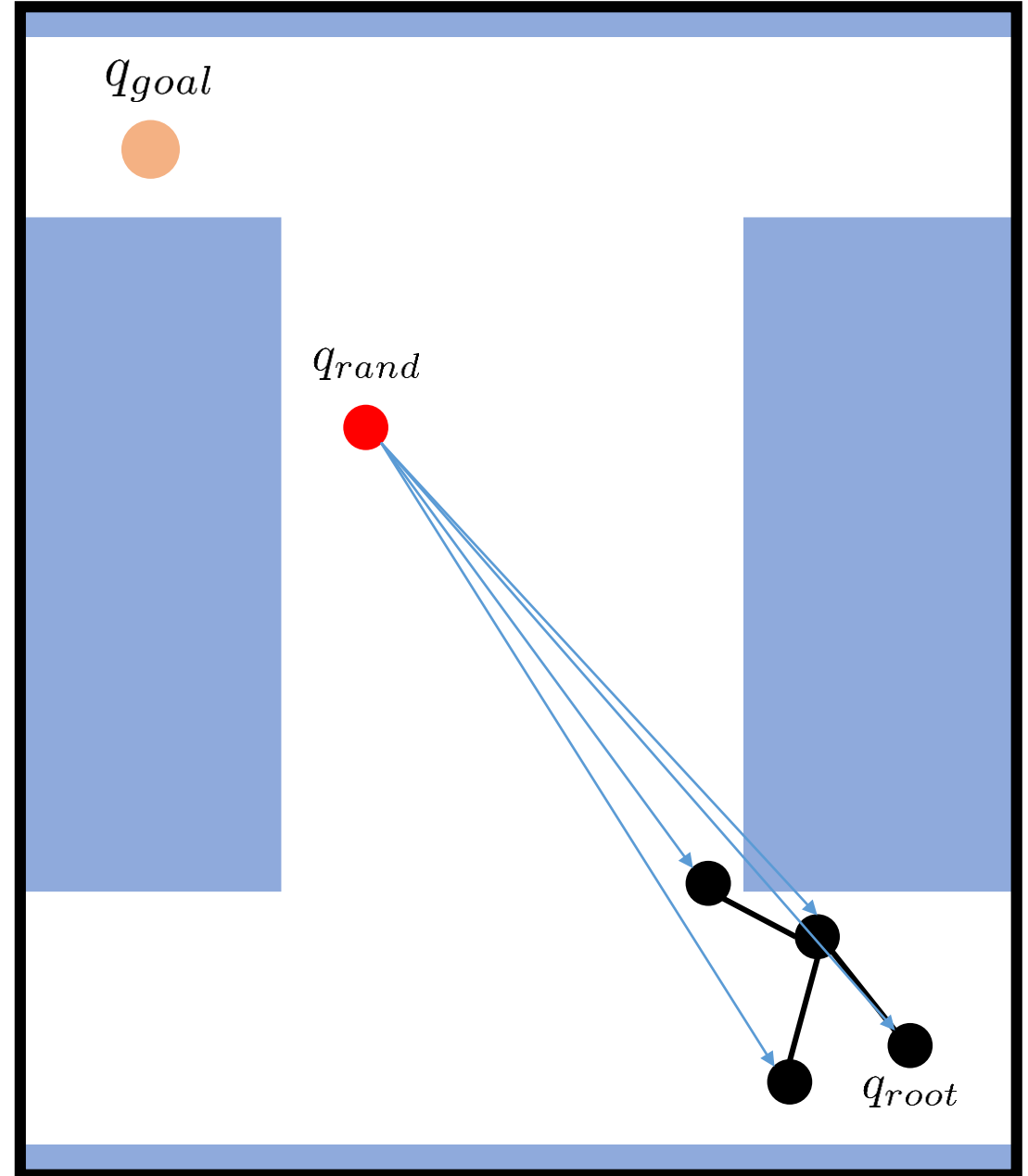
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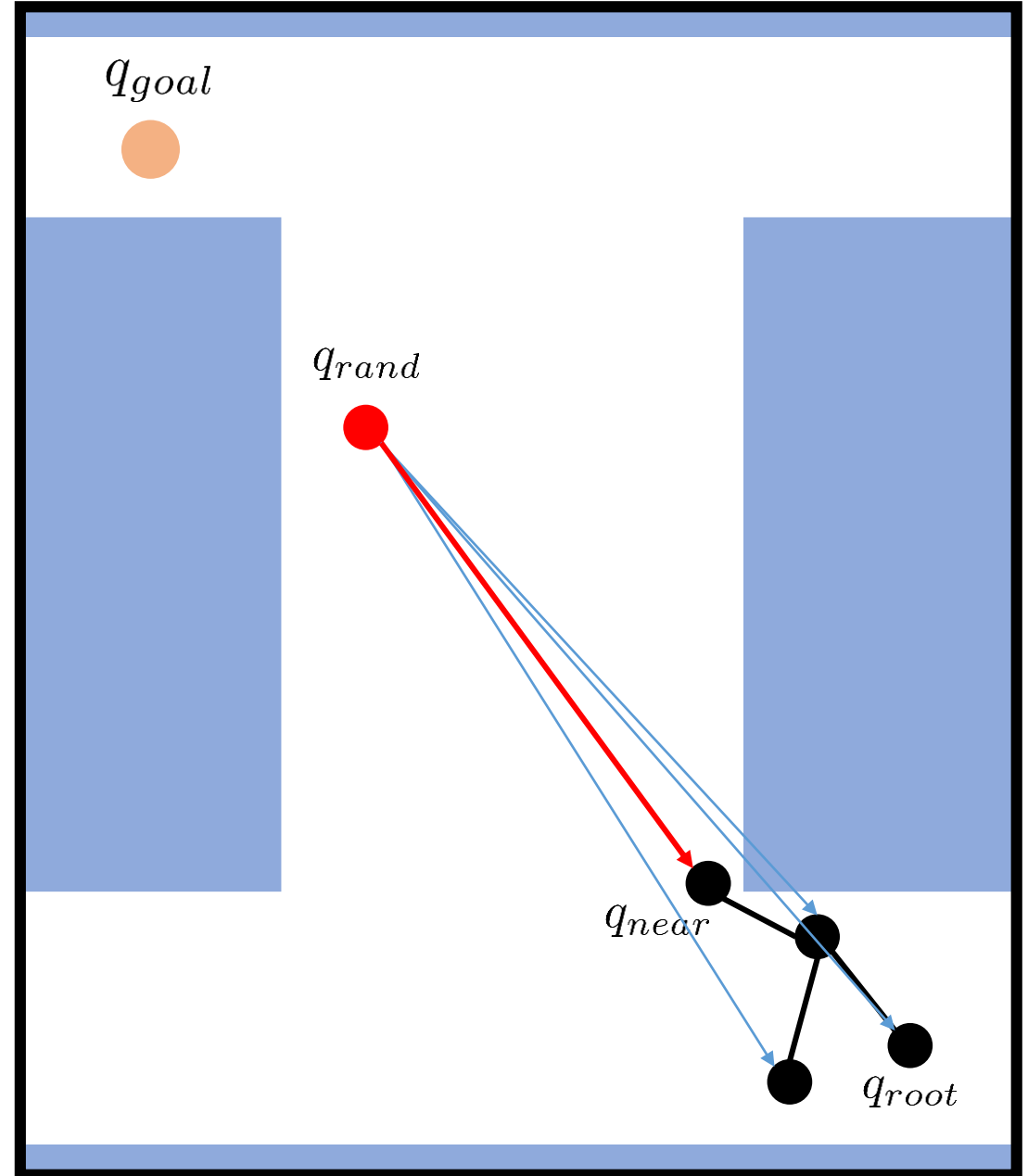
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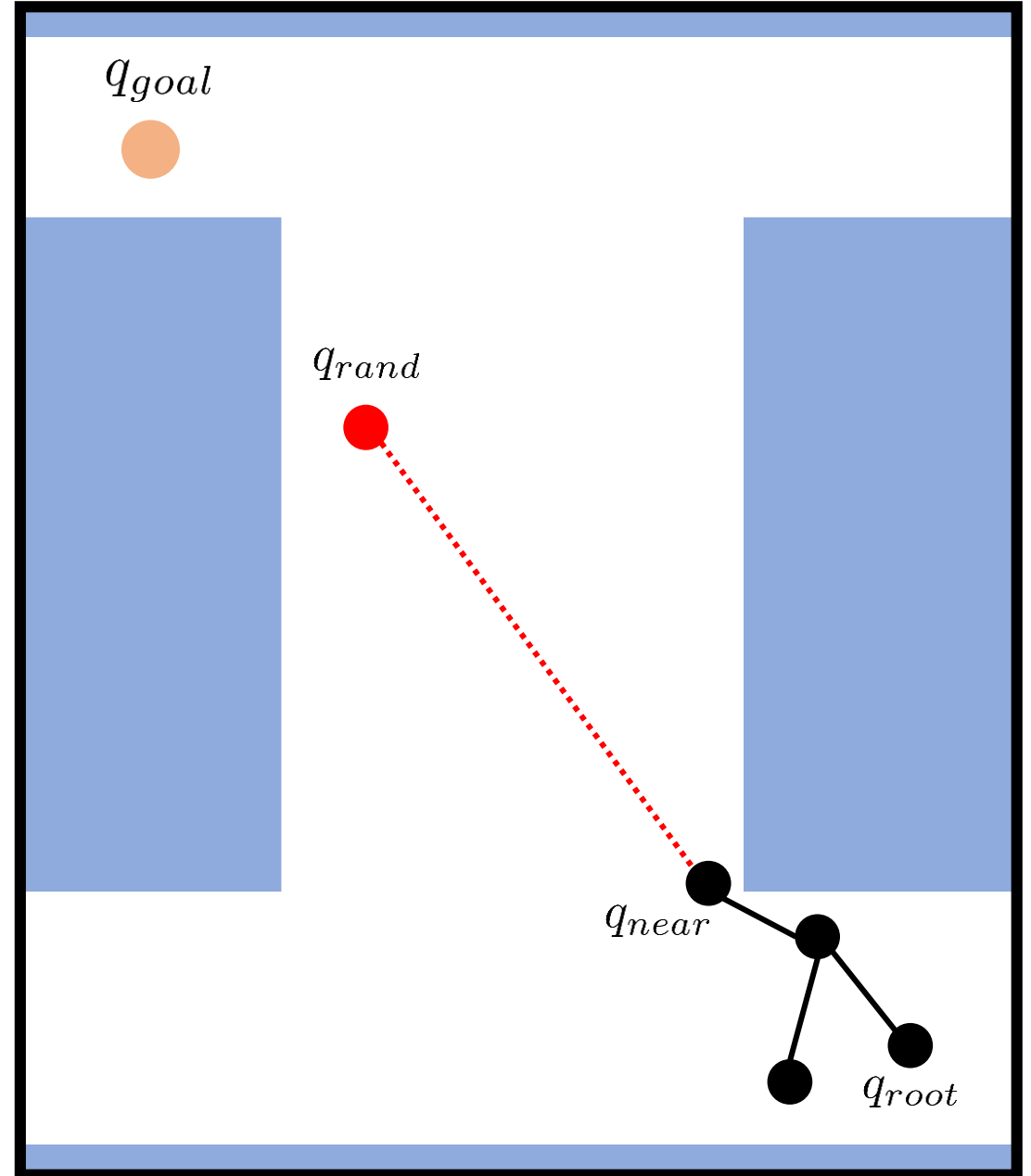
# RRT Review

- RRT - Randomized Sampling



# RRT Review

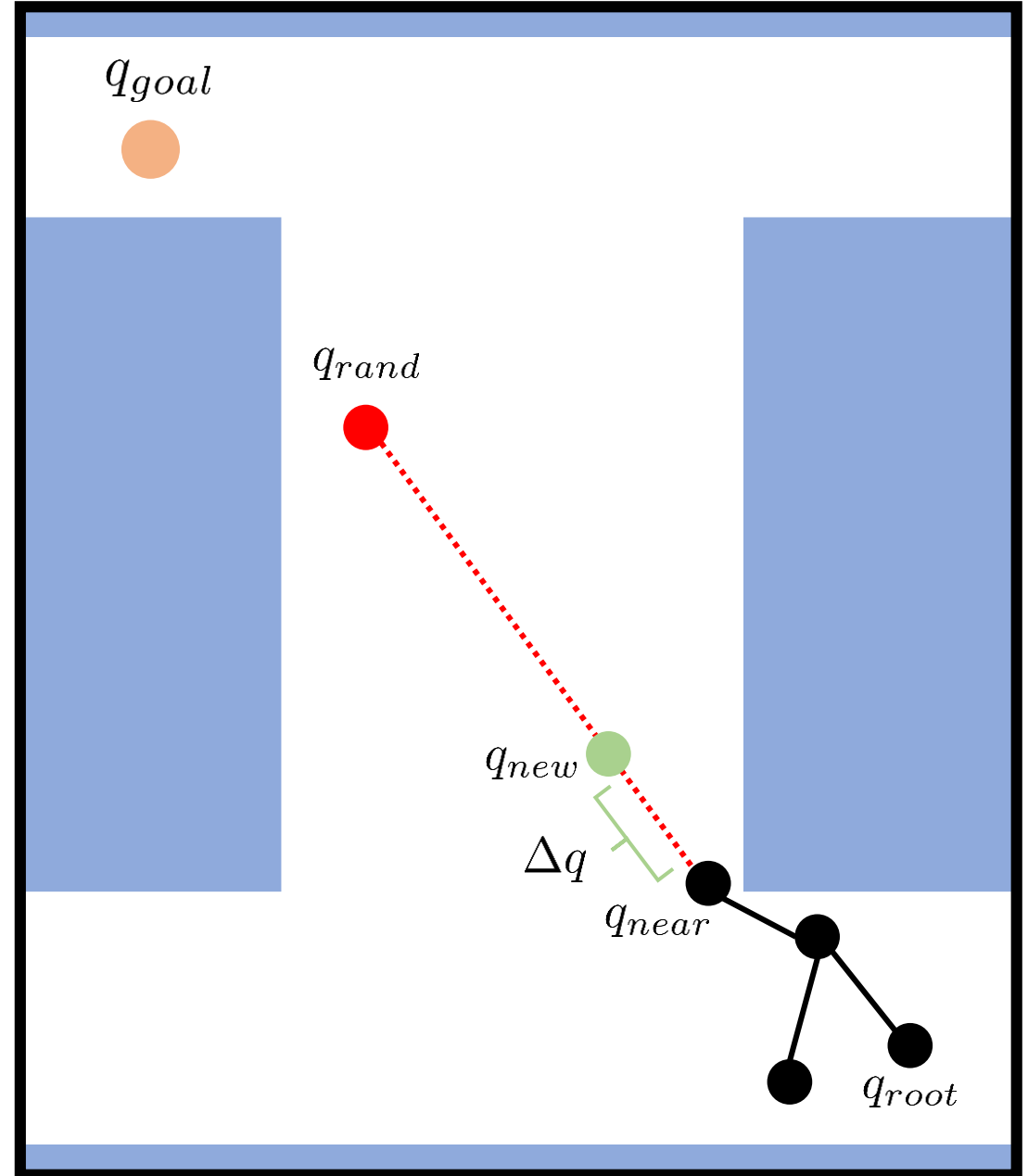
- RRT - Randomized Sampling





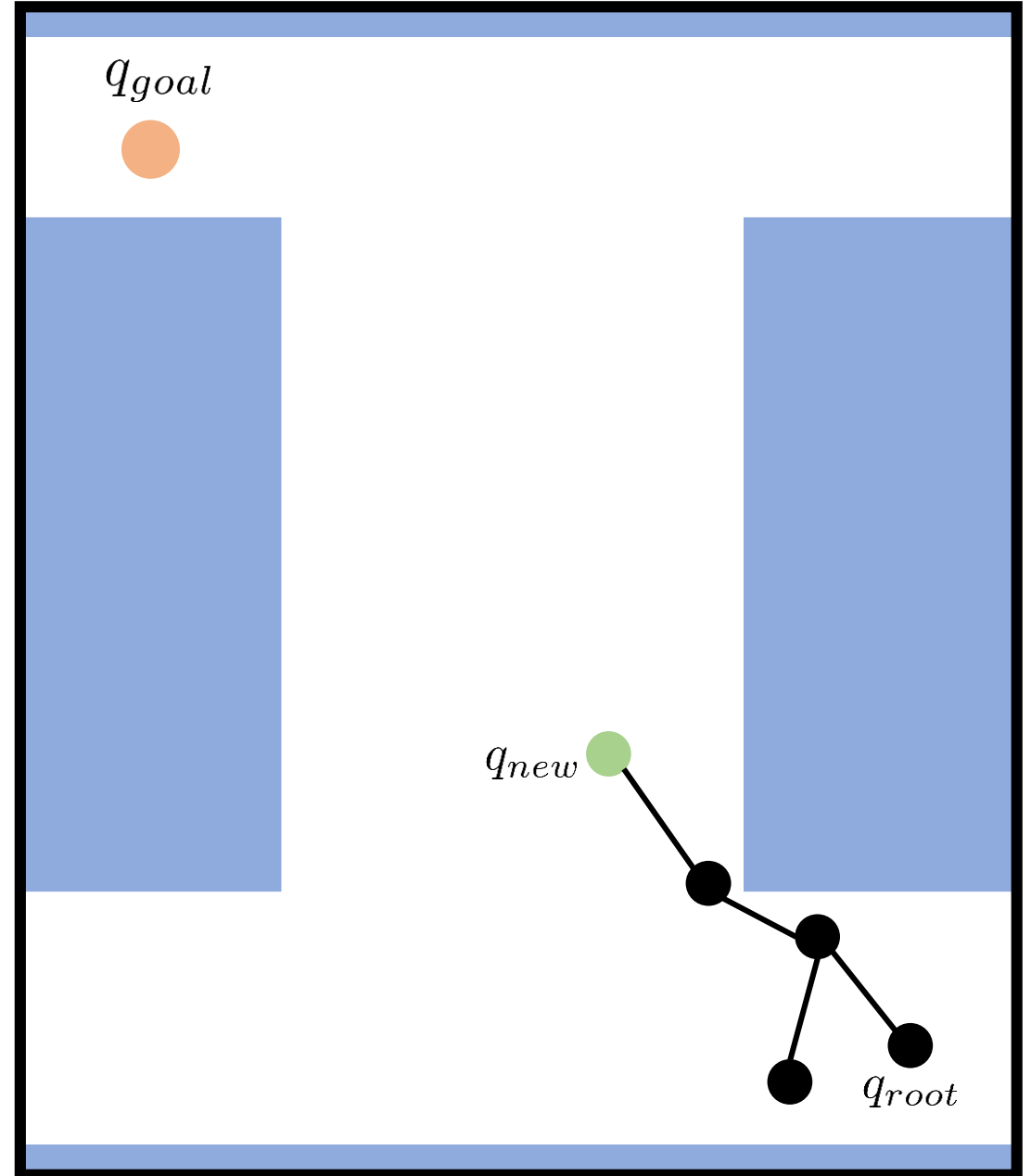
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- RRT - Randomized Sampling



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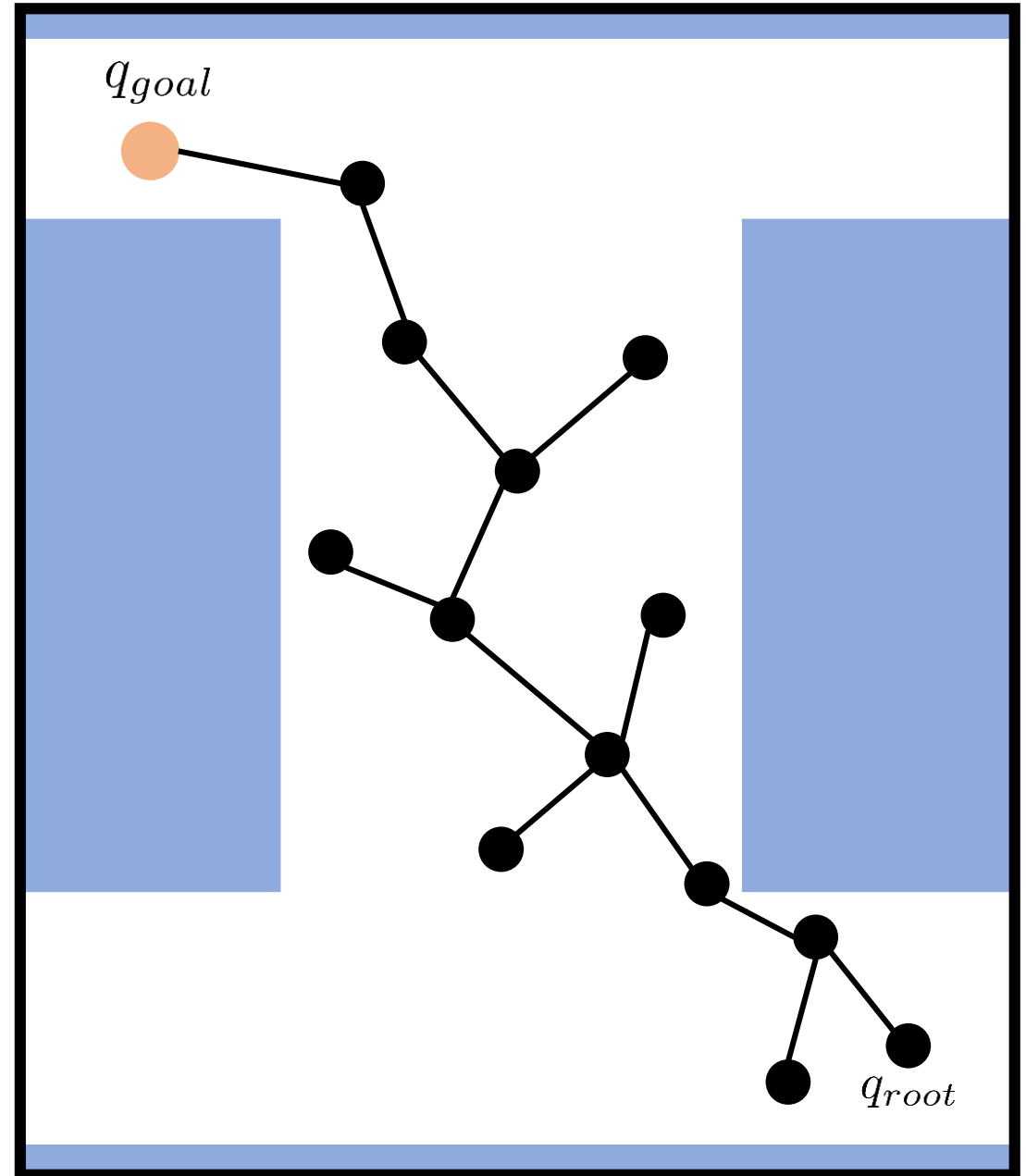






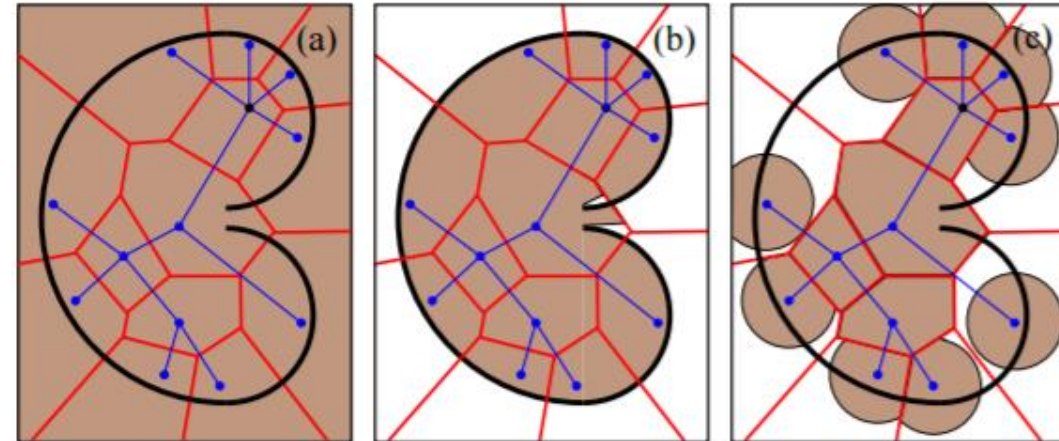
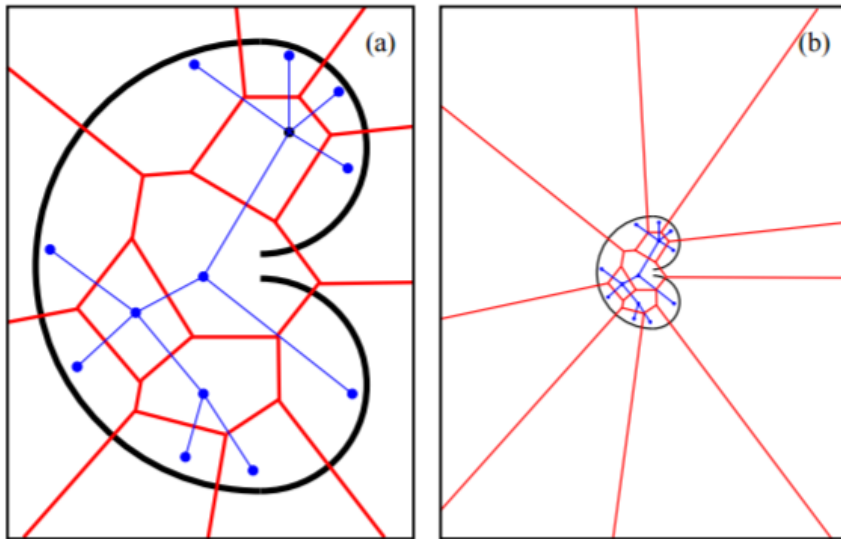
# RRT Review

- RRT - Randomized Sampling
  - + Simple way to construct an approximate model of problem space
  - Weak with narrow and cluttered spaces



# Related Work 1

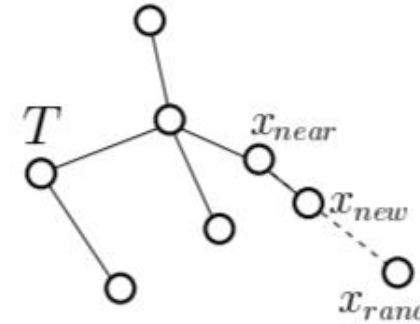
- Dynamic Domain RRT
  - + Reduces unnecessary samples from boundary regions
  - + High probability of sampling narrow passage
  - Worst case same as Regular RRT



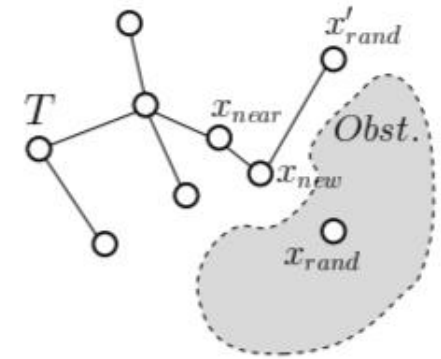
- (a) Regular RRT sampling domain
- (b) Visible Voronoi region
- (c) Dynamic Domain

# Related Work 2

- Obstacle-based RRT (OBRRT) :
    - Growing tree based on obstacle hints
1. Choose a node to grow from –  $x_{near}$
  2. Choose a growth method  $G_i$
  3. Generate target configuration  $x'_{rand}$
  4. Extend from source configuration  $x_{near}$  toward target configuration  $x'_{rand}$



(Basic RRT)



(OBRRT)

G0: Basic Extension

G1: Random position, Same orientation

G2: Random obstacle vector, Random Orientation

G3: Random Obstacle Vector, Same Orientation

G4: Rotation followed by Extension

G5: ...

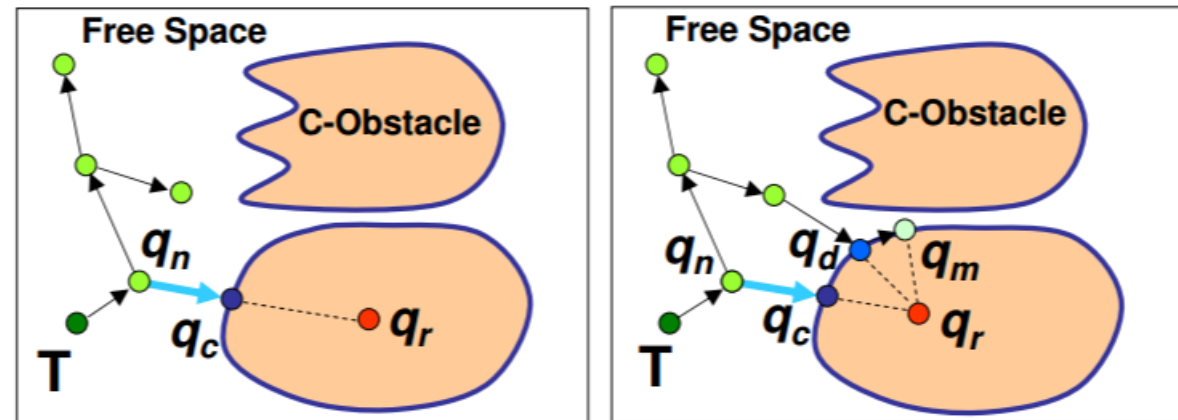
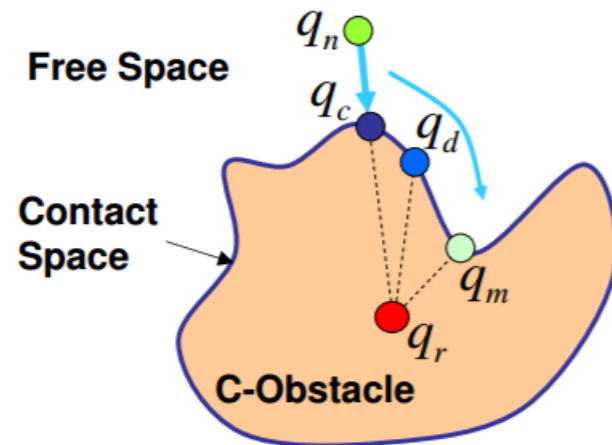
G6: ...

...

G9

# Related Work 3

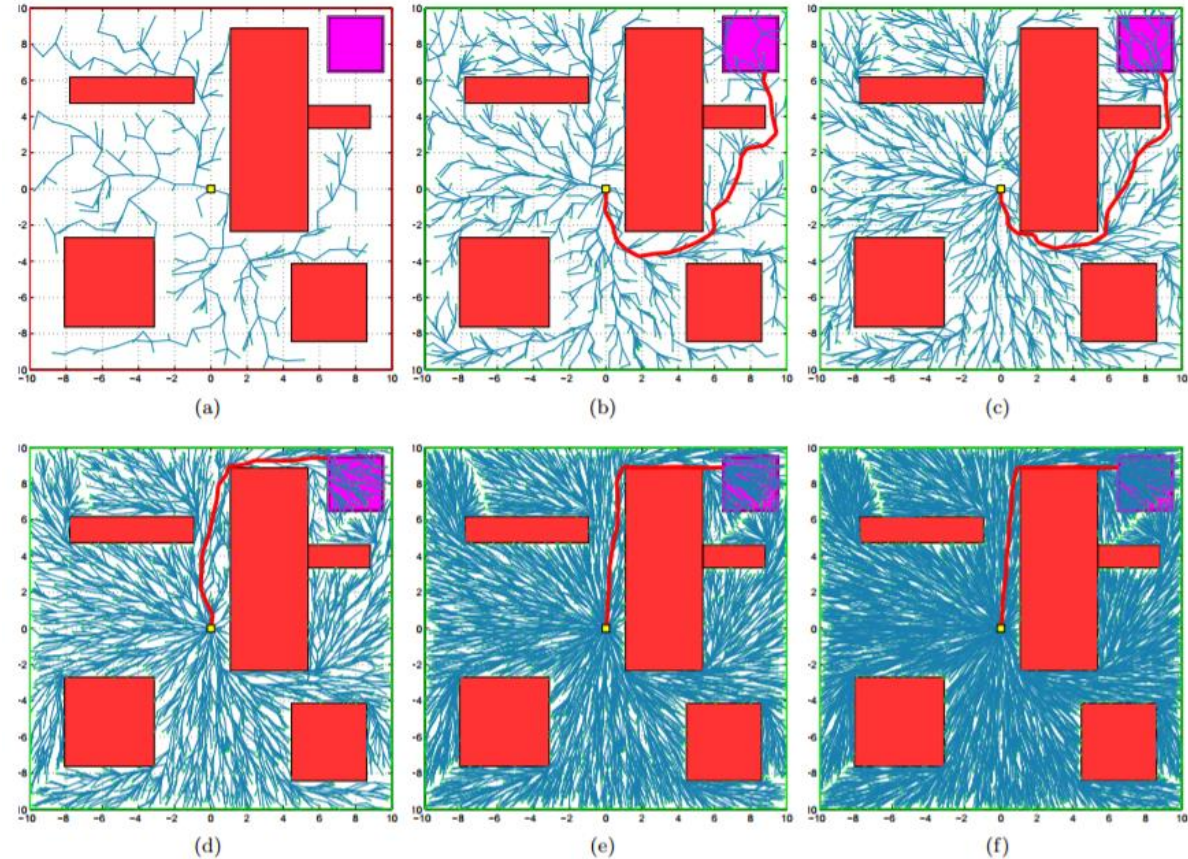
- Retraction-based RRT
  - + Improve performance of RRT in narrow passages by sampling near the boundary of C-obstacle
  - Slower than Regular RRT when there are no narrow passages





# Related Work 4

- RRT\*
  - Tree locally rewires itself to ensure optimization of a cost function
  - + Effective in finding shortest path
  - In practice, it requires many iterations to produce near optimal solutions



(a) 500, (b) 1500, (c) 2500, (d) 5000,  
(e) 10,000, (f) 15,000 iterations

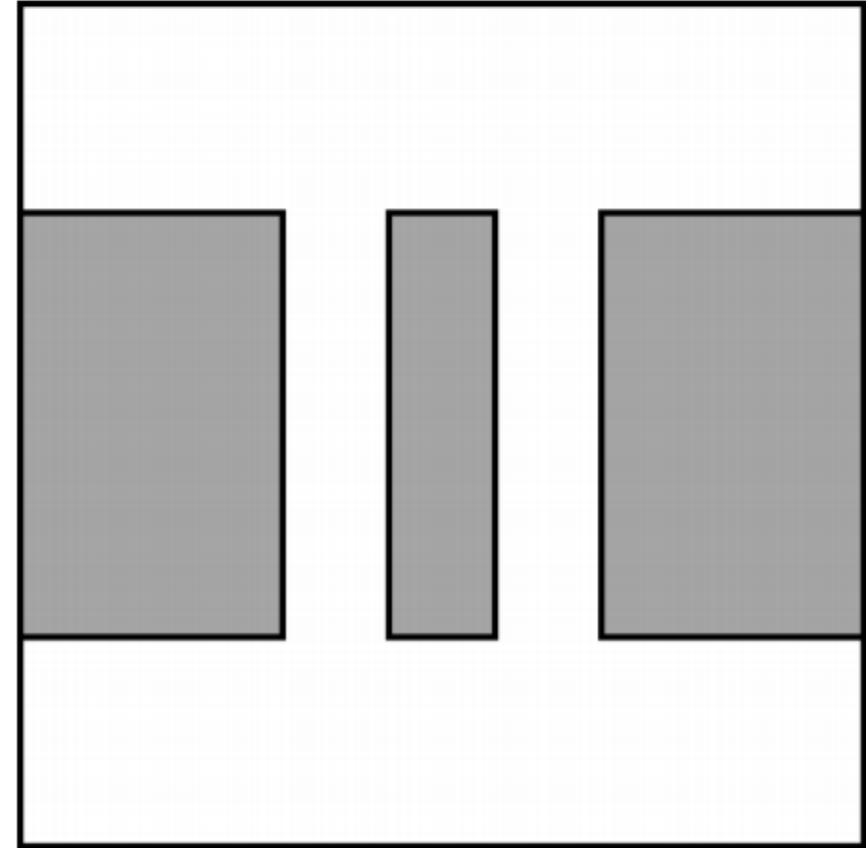
# More Related Works

- RRT-Blossom
- Stable Sparse-RRT
- ...

# Dynamic Region RRT

**Input:** Environment  $e$  and a query  $(q_s, q_g)$

1.  $G \leftarrow$  Compute Embedding Graph( $e$ )  
[pre computation]
2.  $F \leftarrow$  Compute Flow Graph ( $G, q_s, q_g$ )
3.  $R \leftarrow$  Initialize Regions ( $F, q_s$ )
4. While not done do
5.     Region Biased RRT Growth ( $F, R$ )

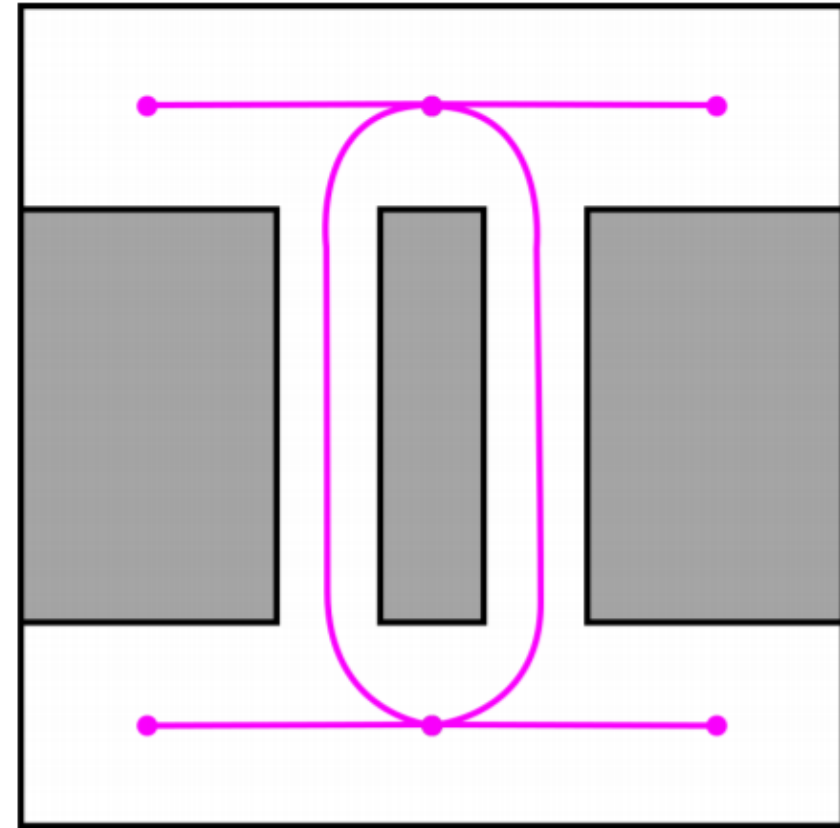


(a) Environment

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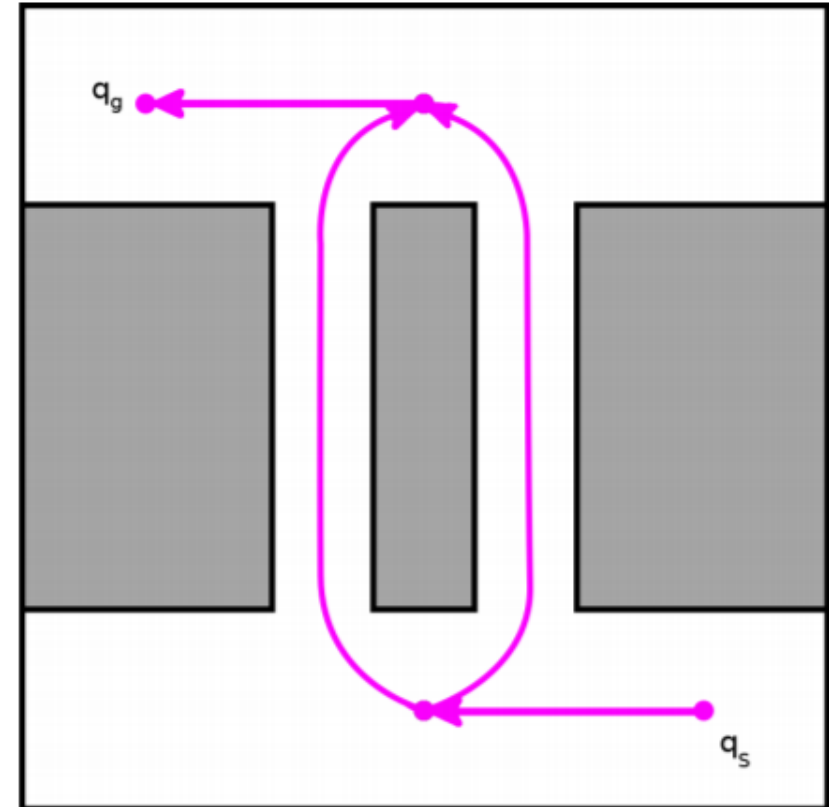


(b) Embedded Graph

# Dynamic Region RRT

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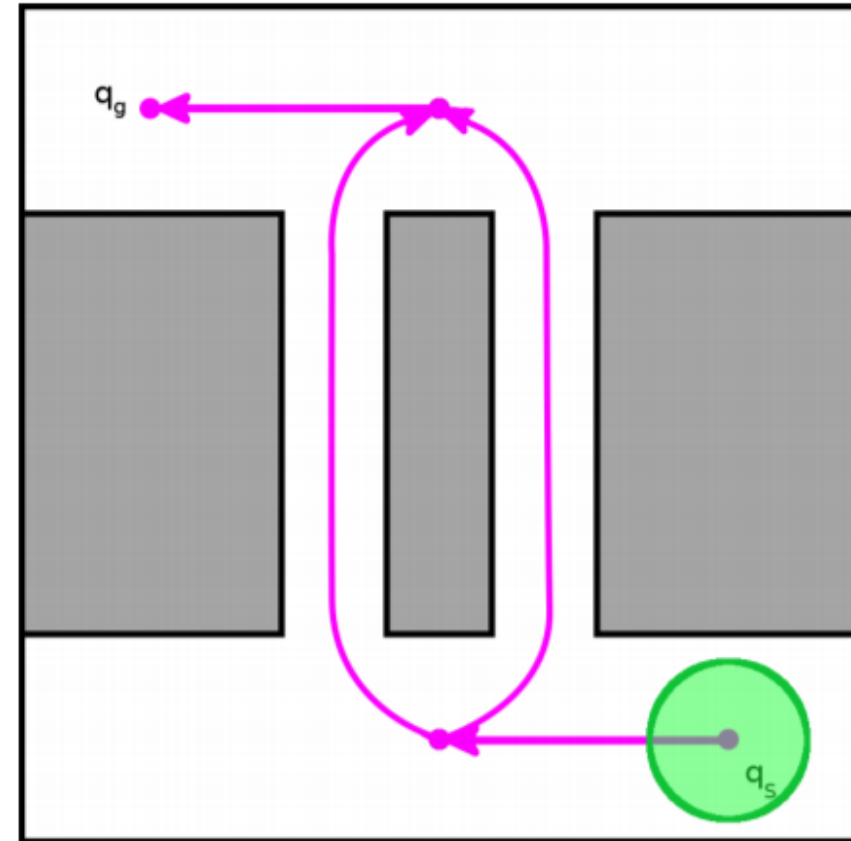


(c) Flow Graph

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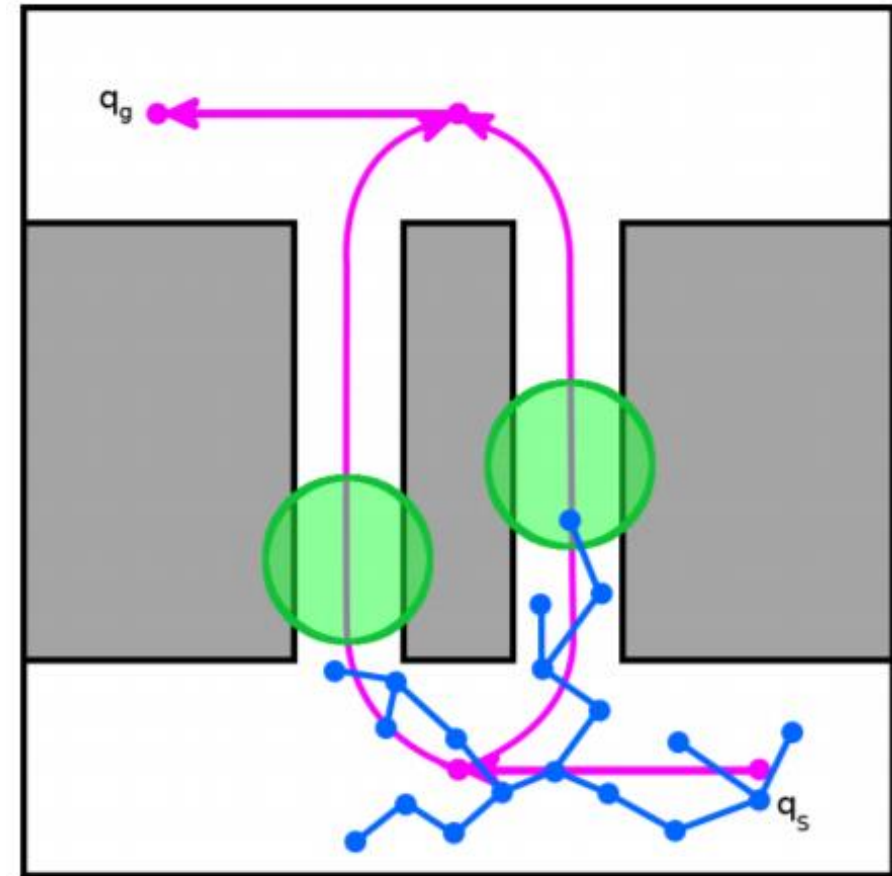


(d) Initial Regions

# Dynamic Region RRT

**Input:** Environment  $e$  and a query  $(q_s, q_g)$

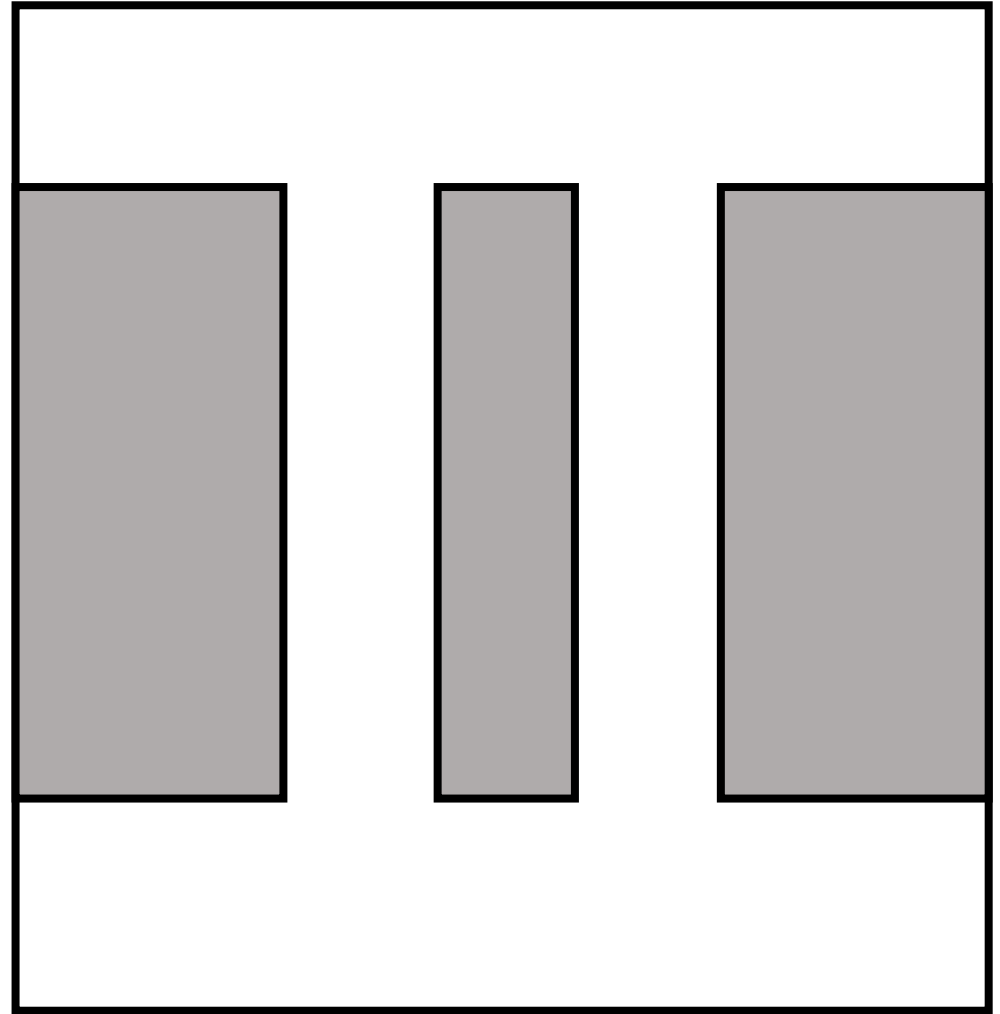
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(f) Multiple Regions

# 1. Embedding Graph

- Computing Embedding Graph

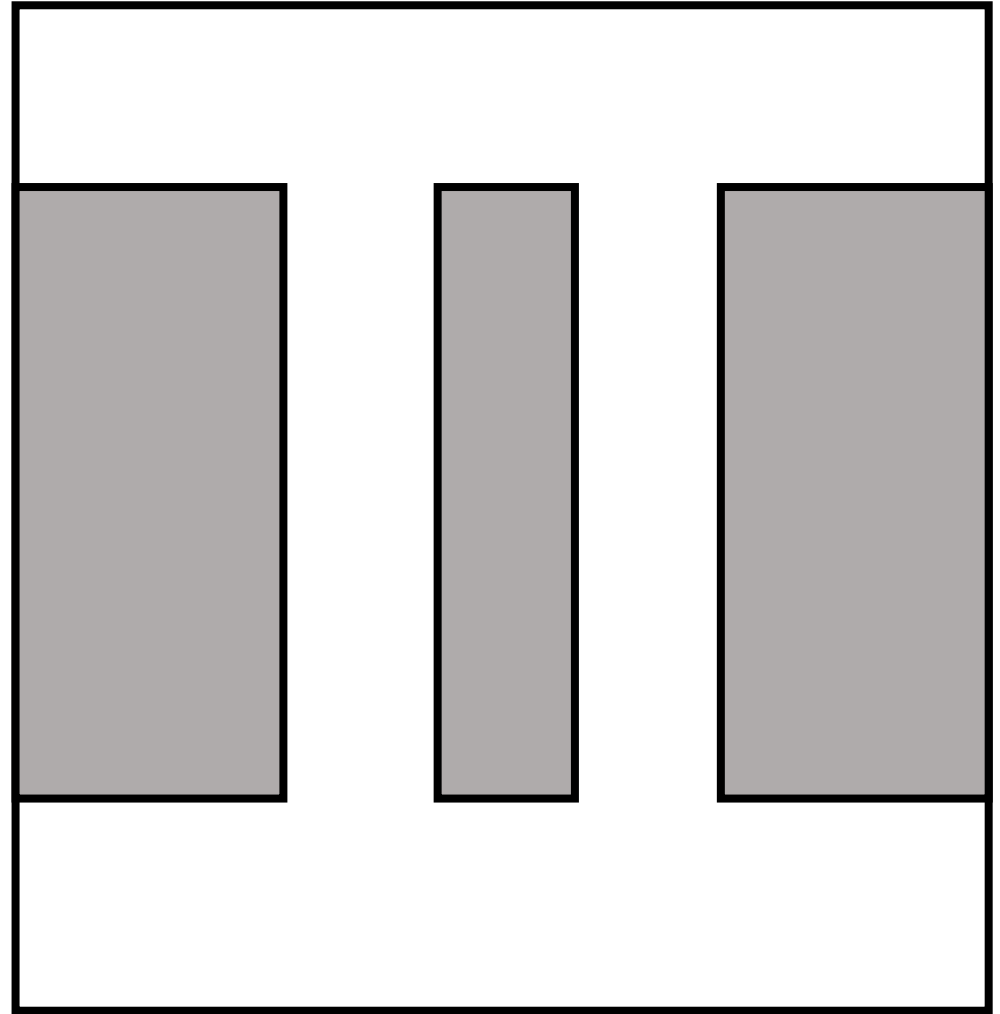
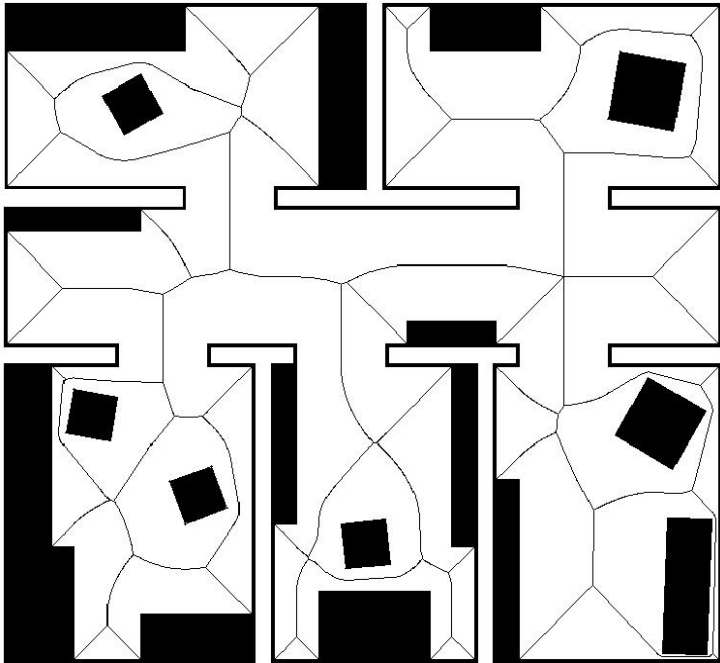




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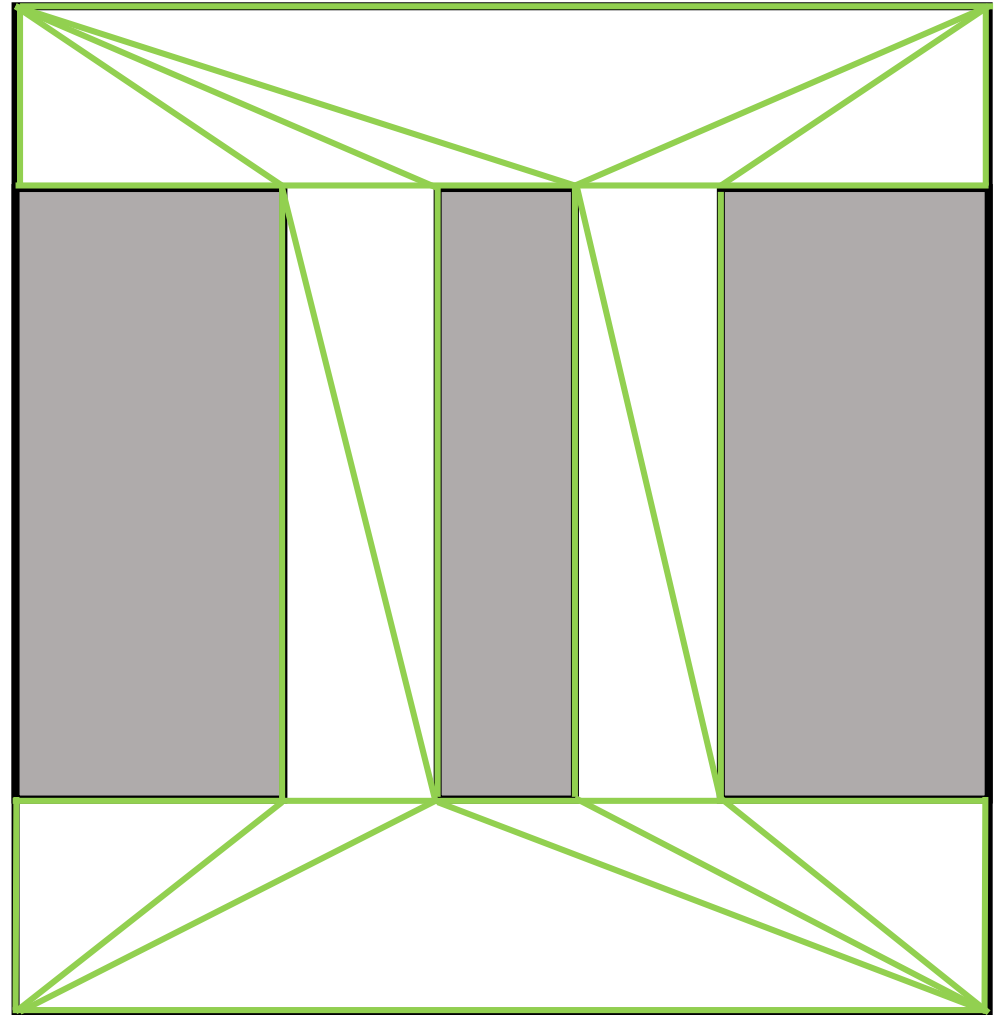
- Computing Embedding Graph

Generalized Voronoi Graph



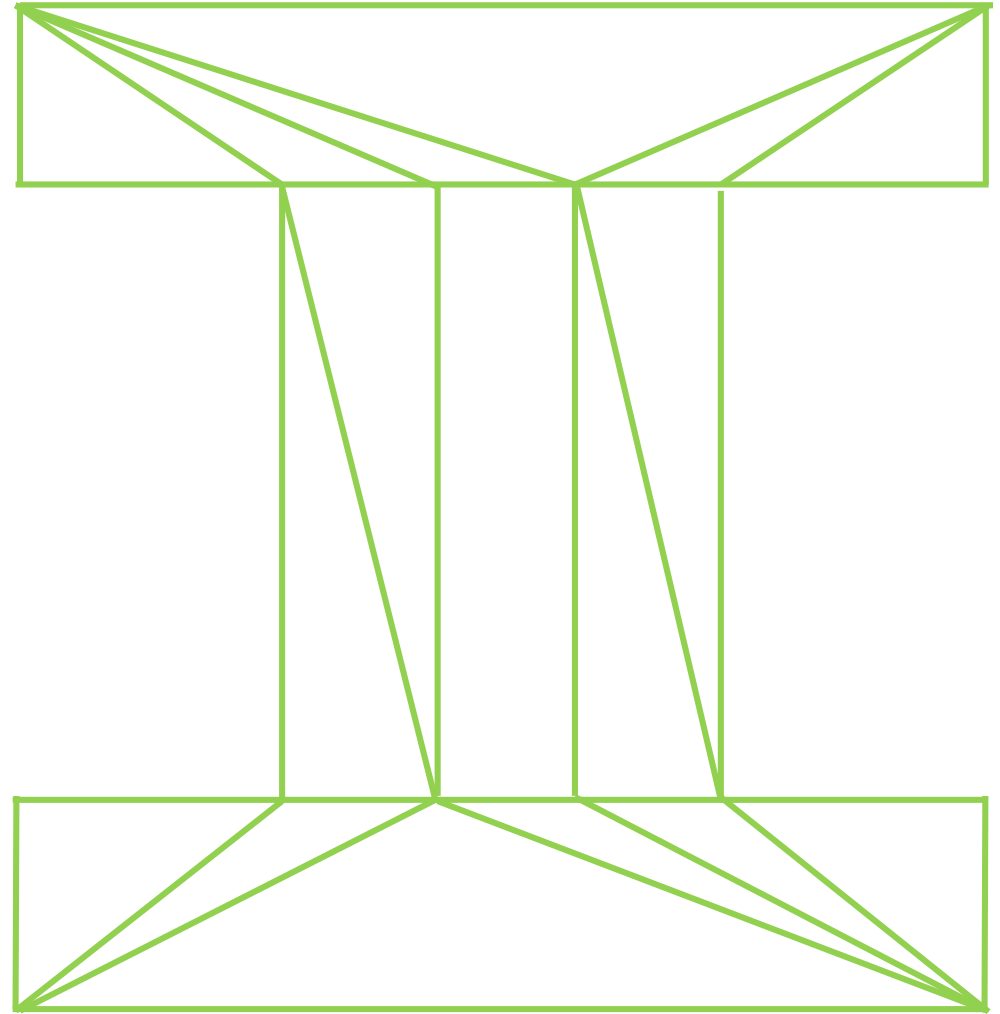
# 1. Embedding Graph

- Computing Embedding Graph
  1. Compute Tetrahedralization of the environment



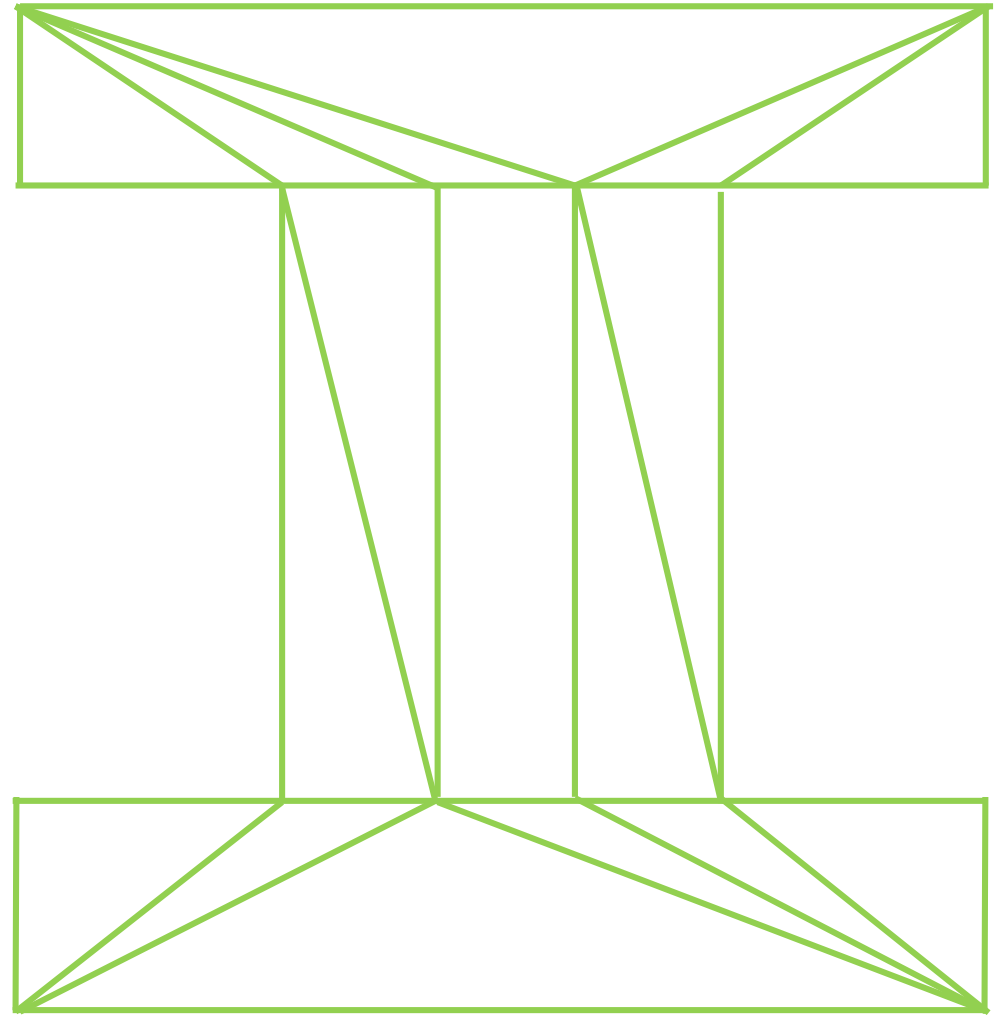
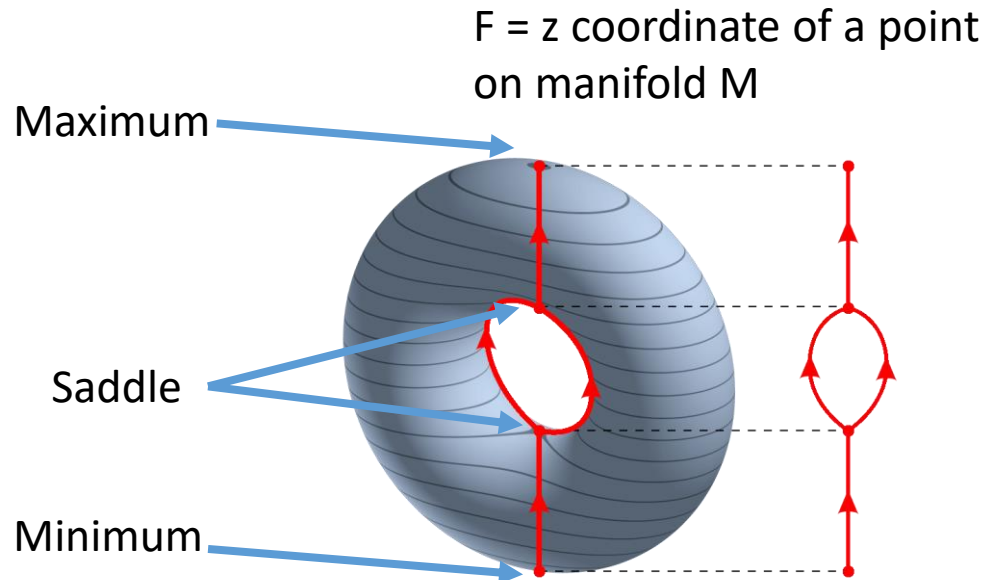
# 1. Embedding Graph

- Computing Embedding Graph
  1. Compute Tetrahedralization of the environment
  2. Construct a Reeb Graph from the Tetrahedralization



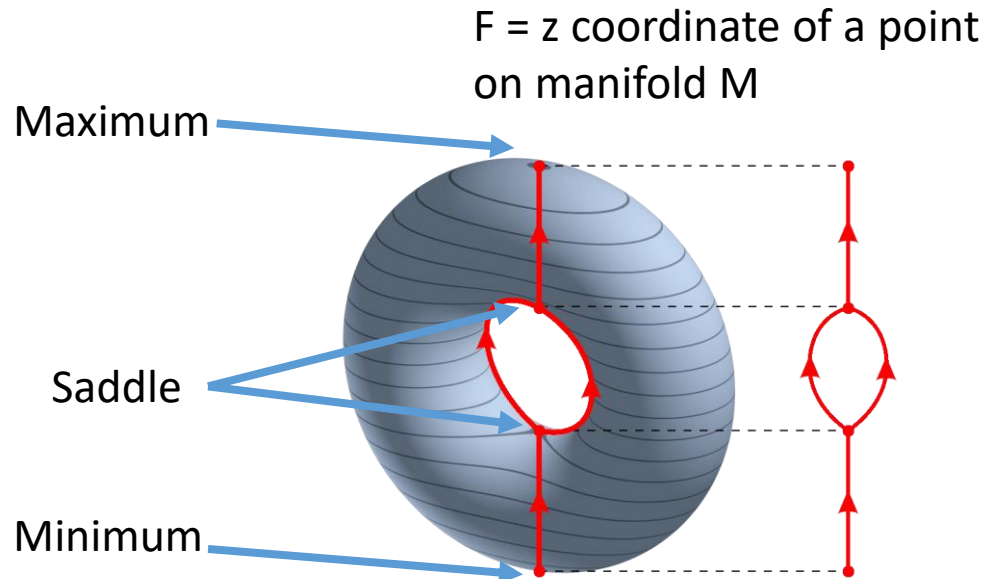
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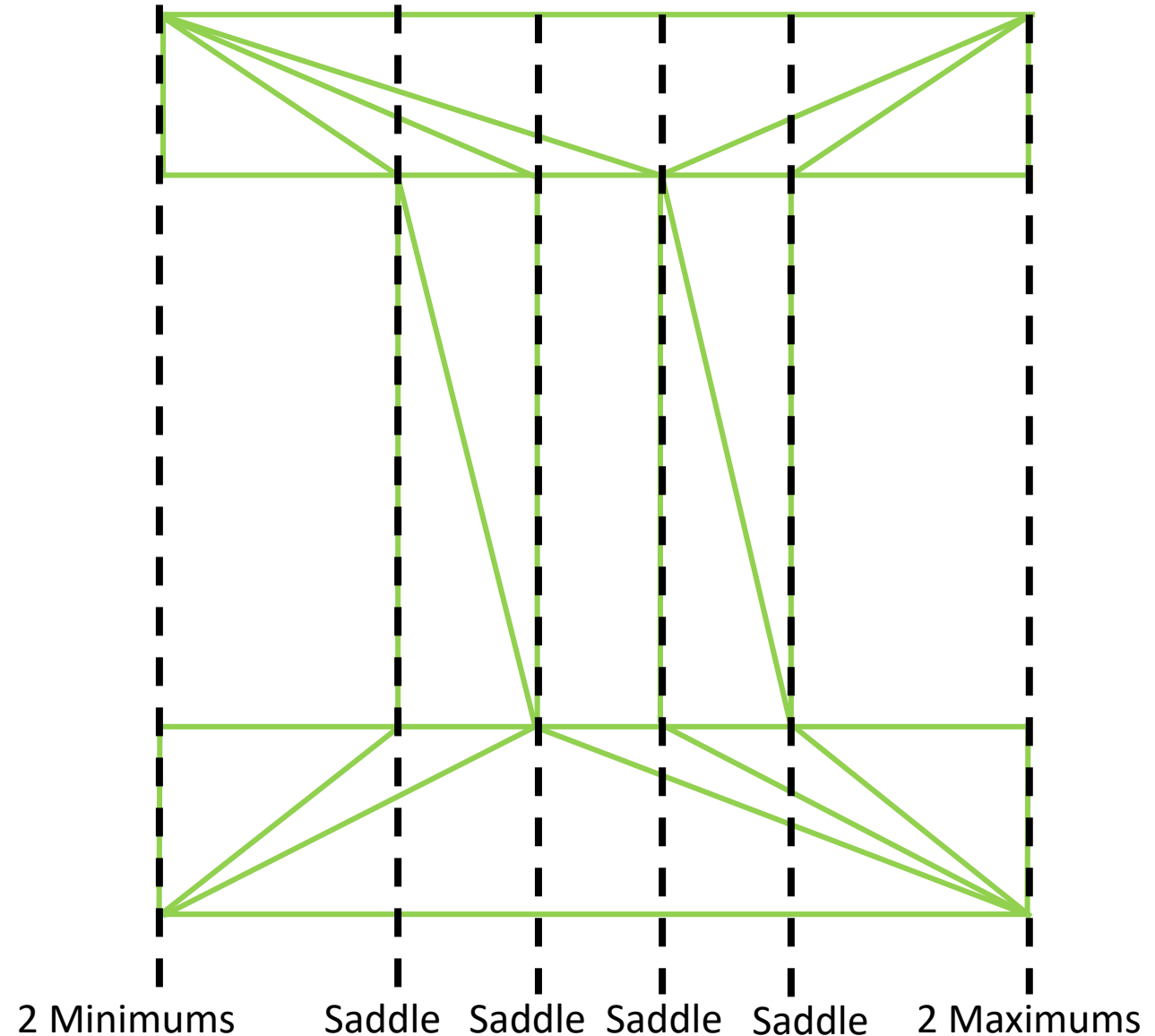


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  2. **Construct a Reeb Graph from the Tetrahedralization**

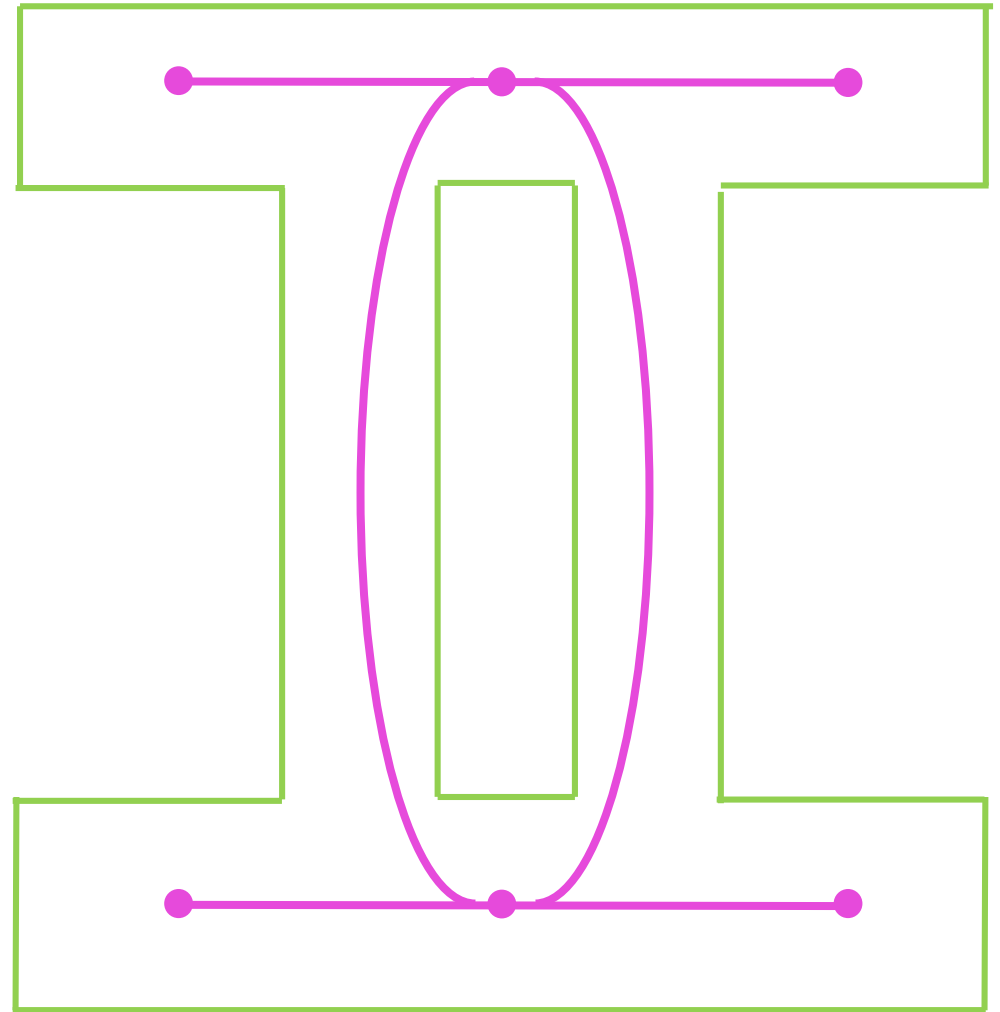
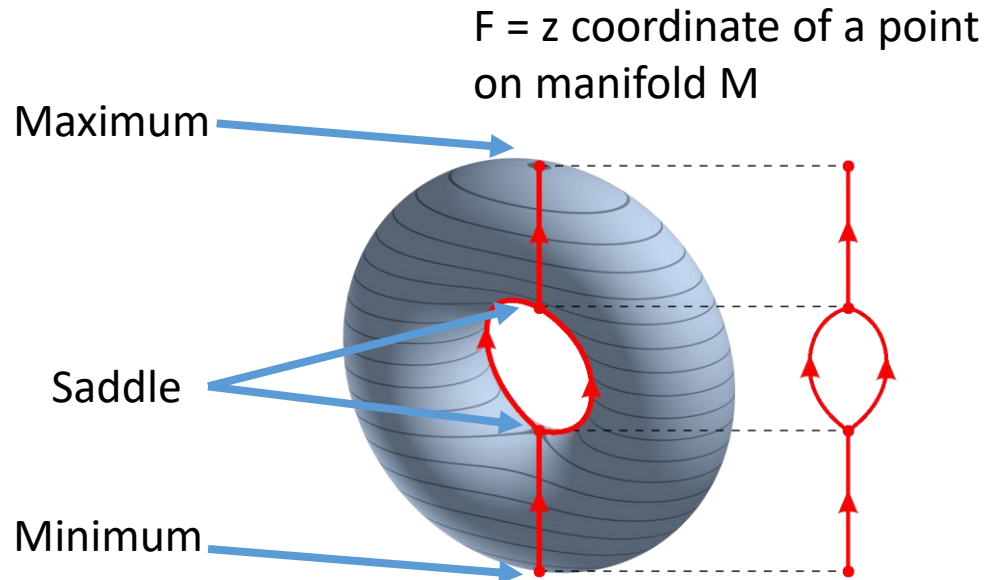


$F = y$  coordinate of a point on manifold  $M$



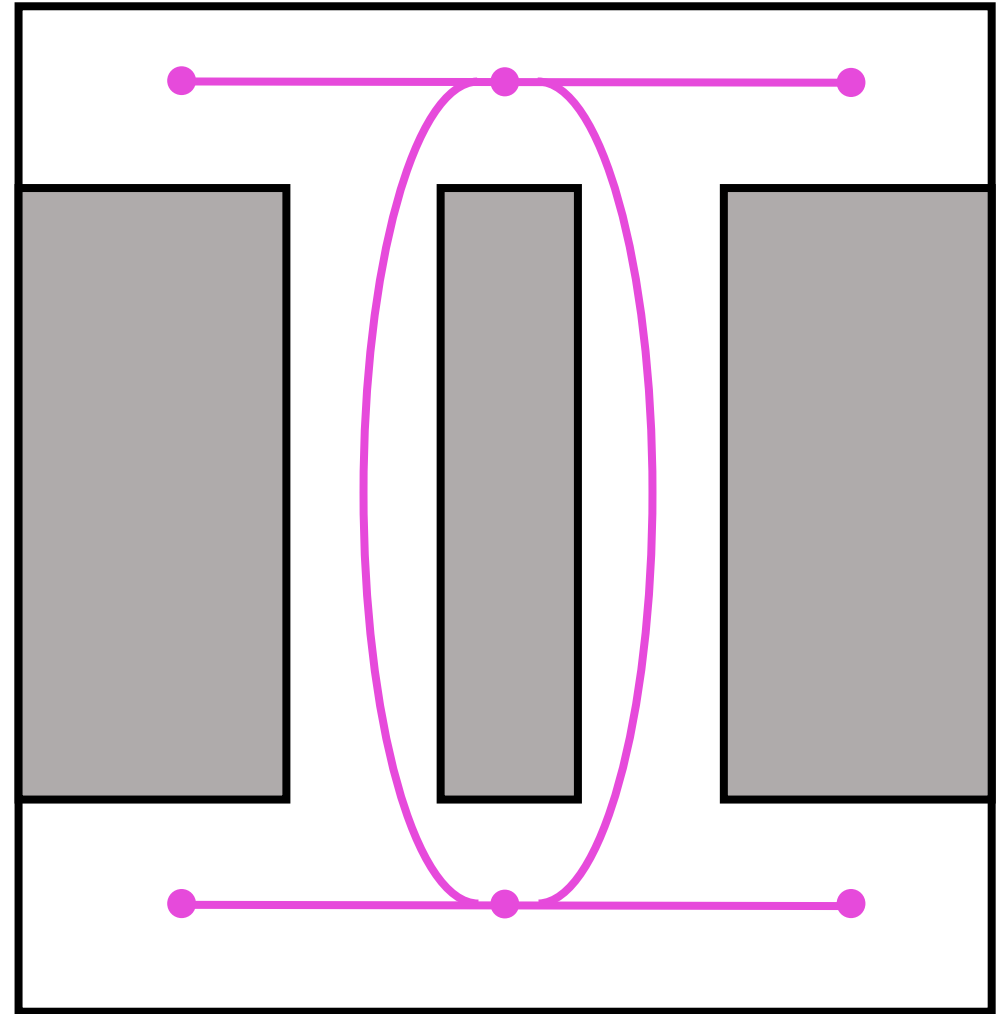
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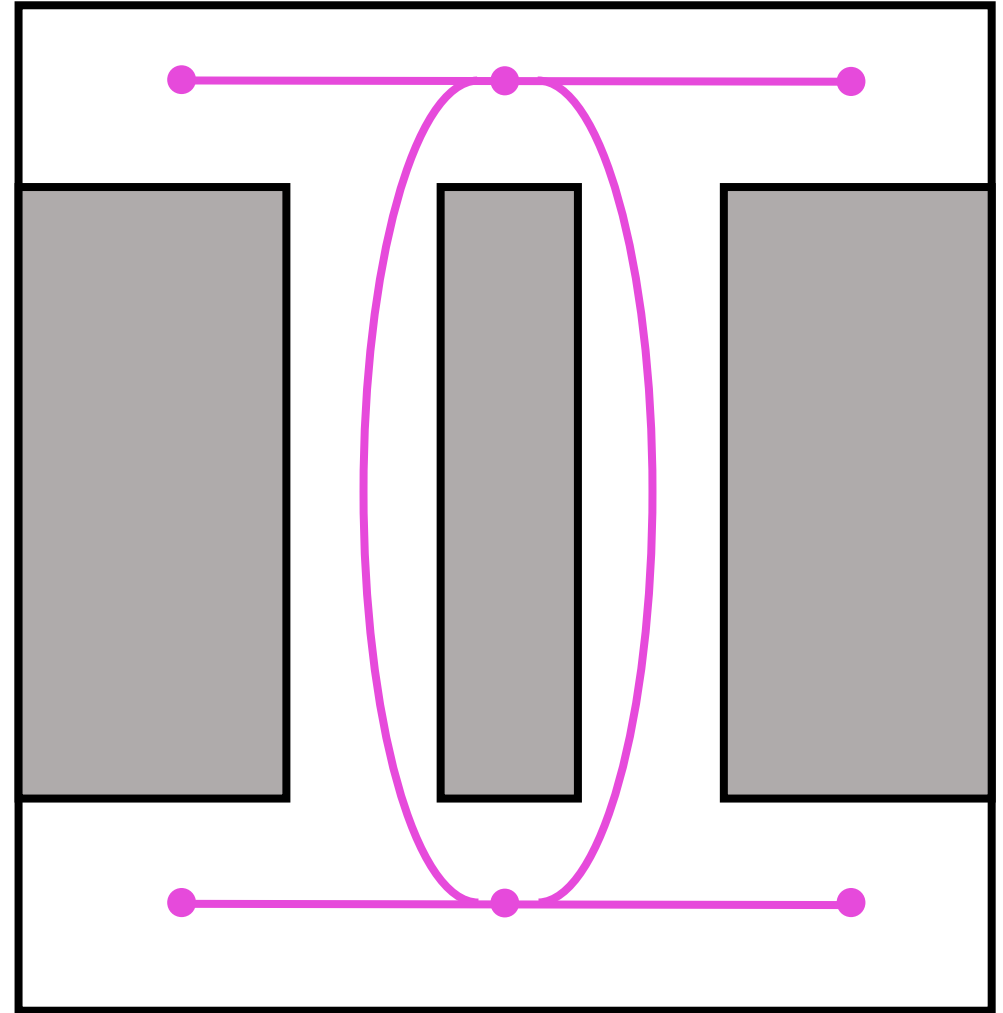
- Computing Embedding Graph
  1. Compute Tetrahedralization of the environment
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  3. Embed the Reeb graph back to the Environment



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Naïve Reeb Graph Algorithm:  $O(n^2)$



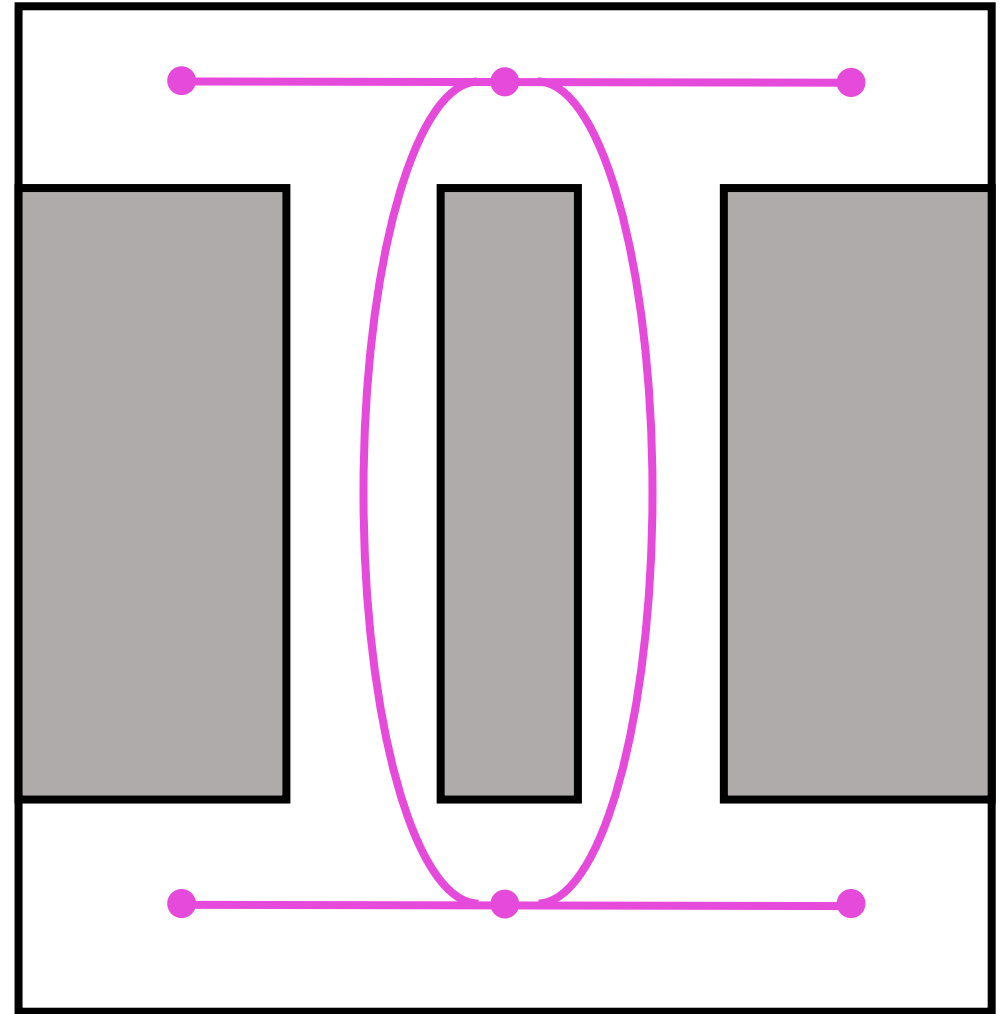


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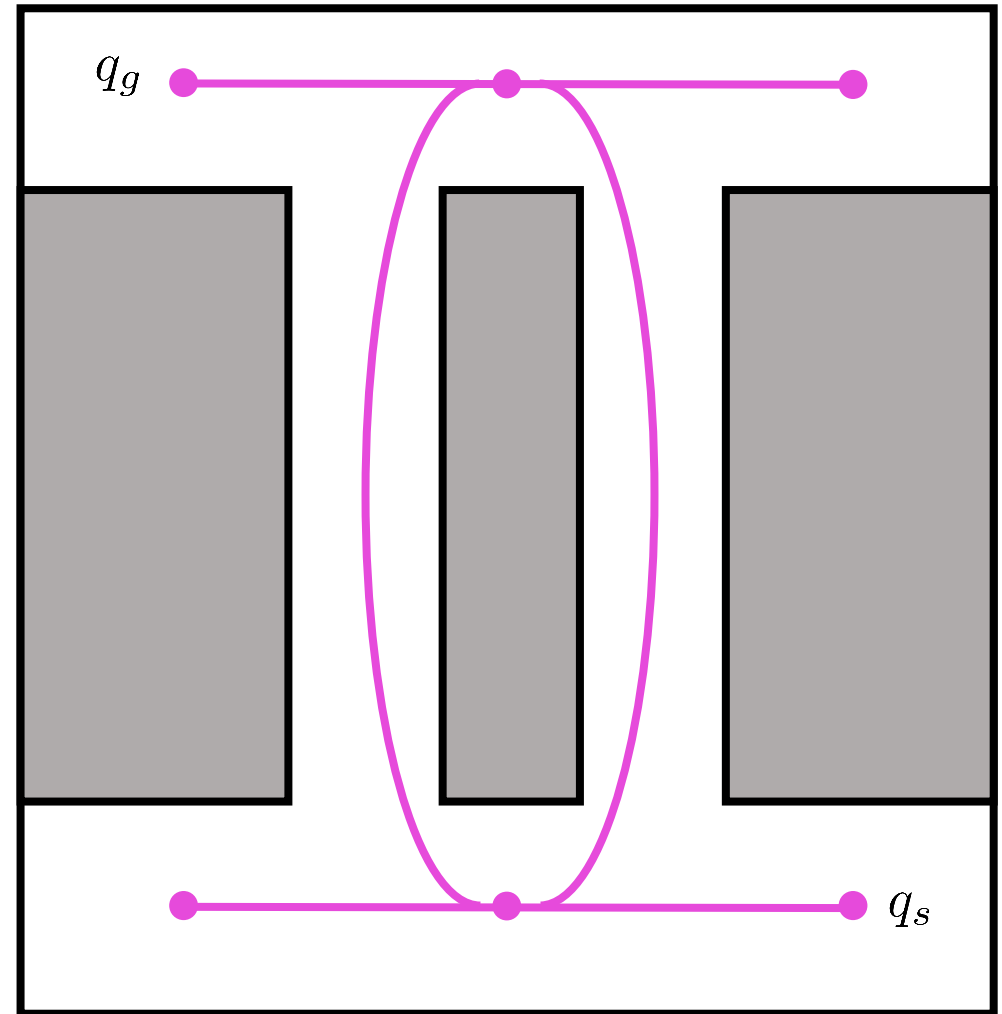
Naïve Reeb Graph Algorithm:  $O(n^2)$

Fast Reeb Graph Algorithm:  $O(n \log(n))$



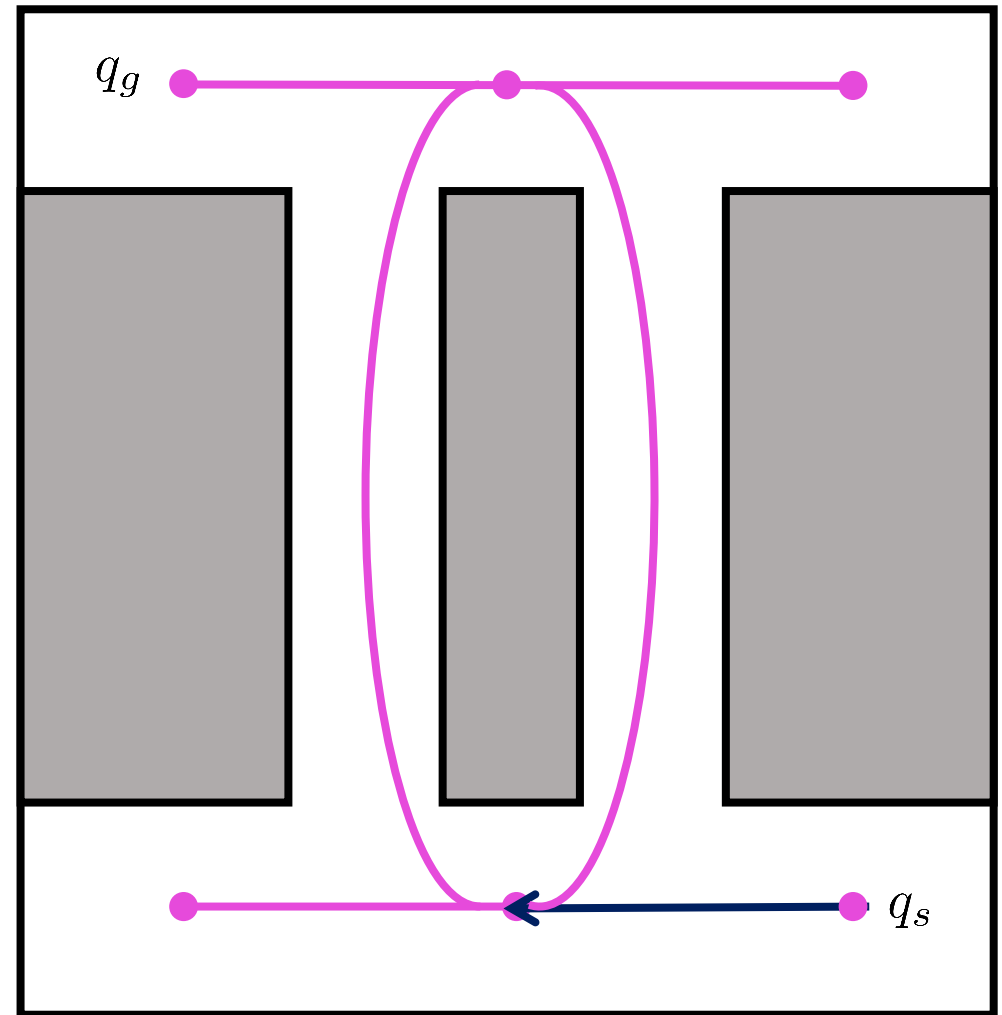
## 2. Flow Graph

- Computing Flow Graph



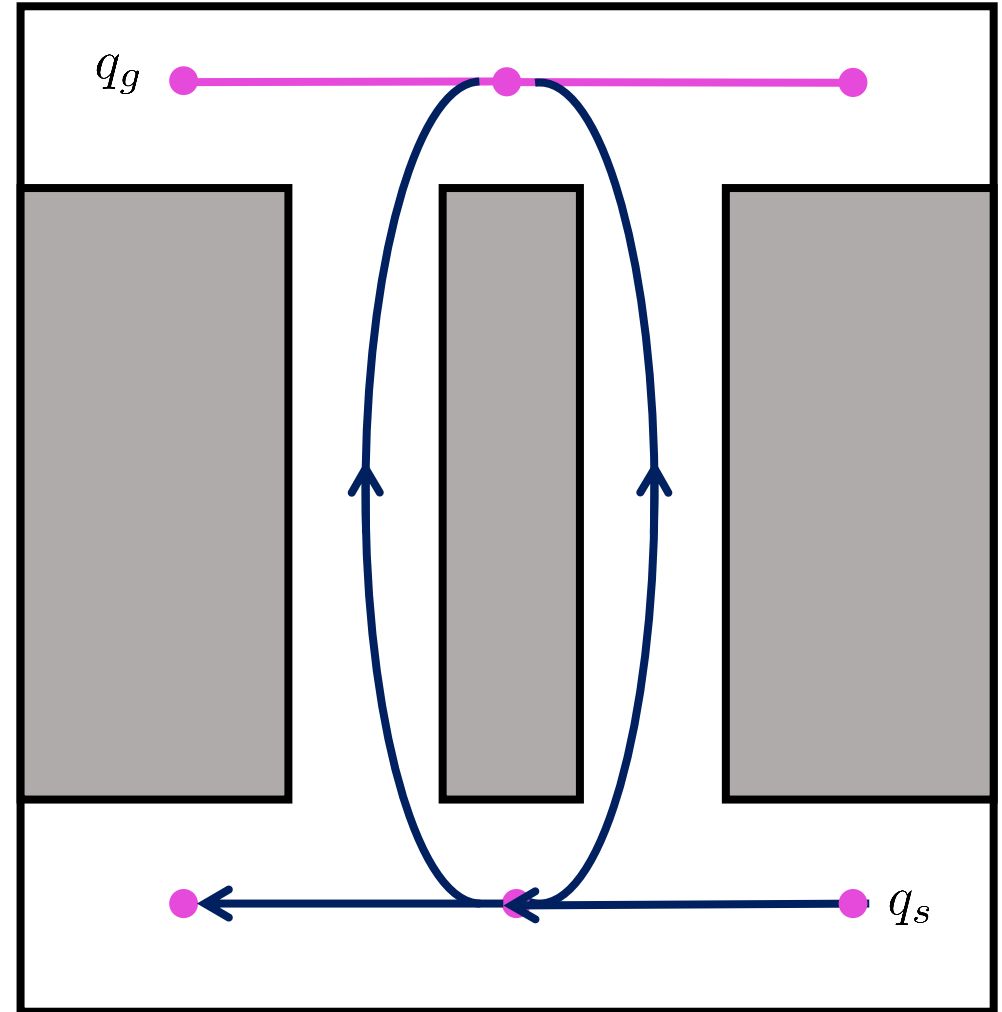
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- Computing Flow Graph
  1. Perform BFS from the nearest node  $q_s$



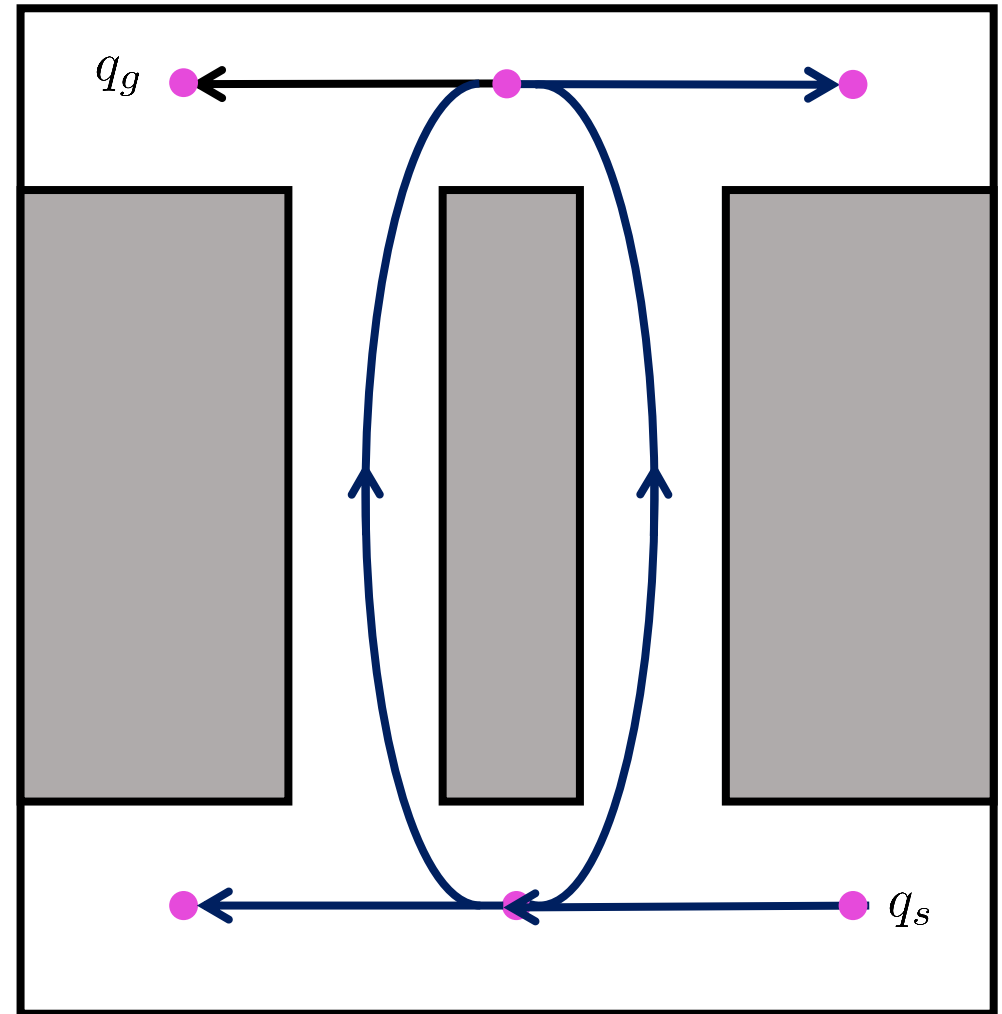
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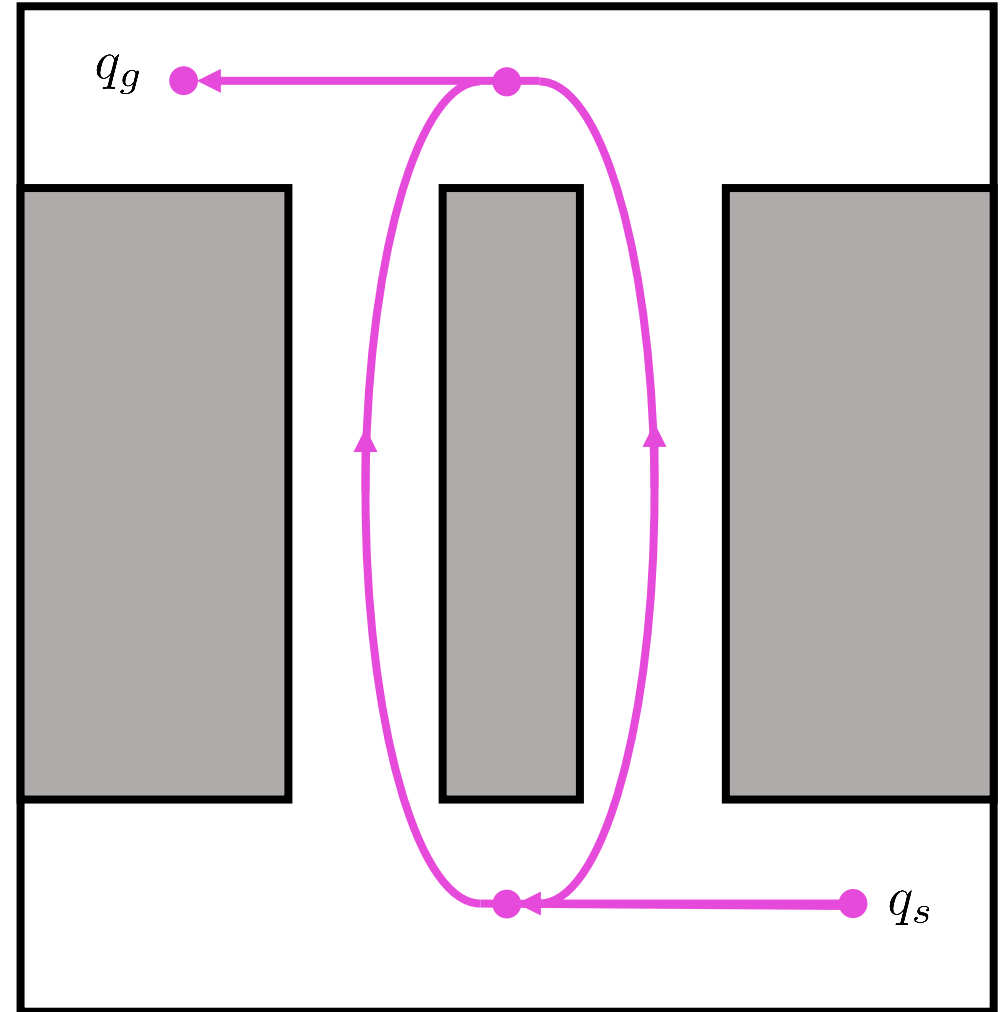






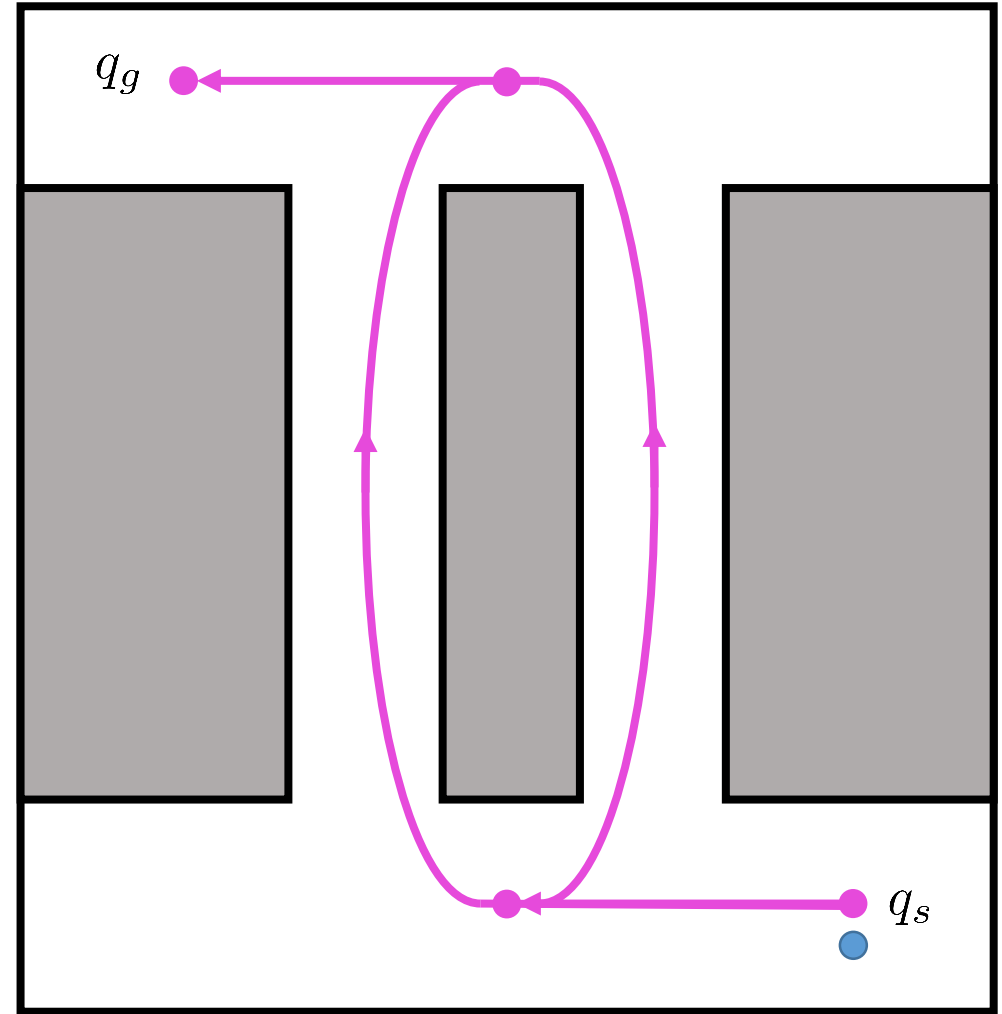
## 2. Flow Graph

- Computing Flow Graph
  1. Perform BFS from the nearest node  $q_s$
  2. Backtrack from the nearest node to  $q_g$  to trim unrelated edges to a solution path (pruning)



### 3. Region-biased RRT Growth

- Four steps

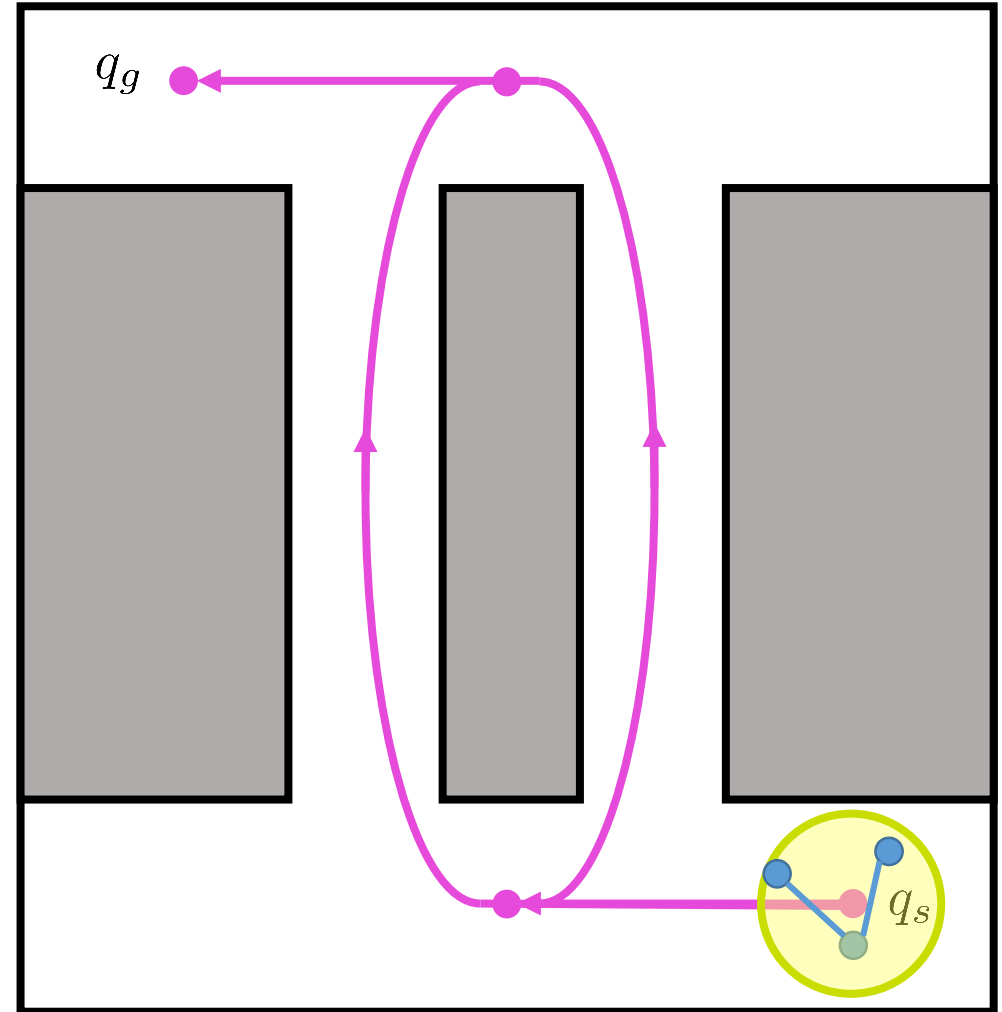


### 3. Region-biased RRT Growth

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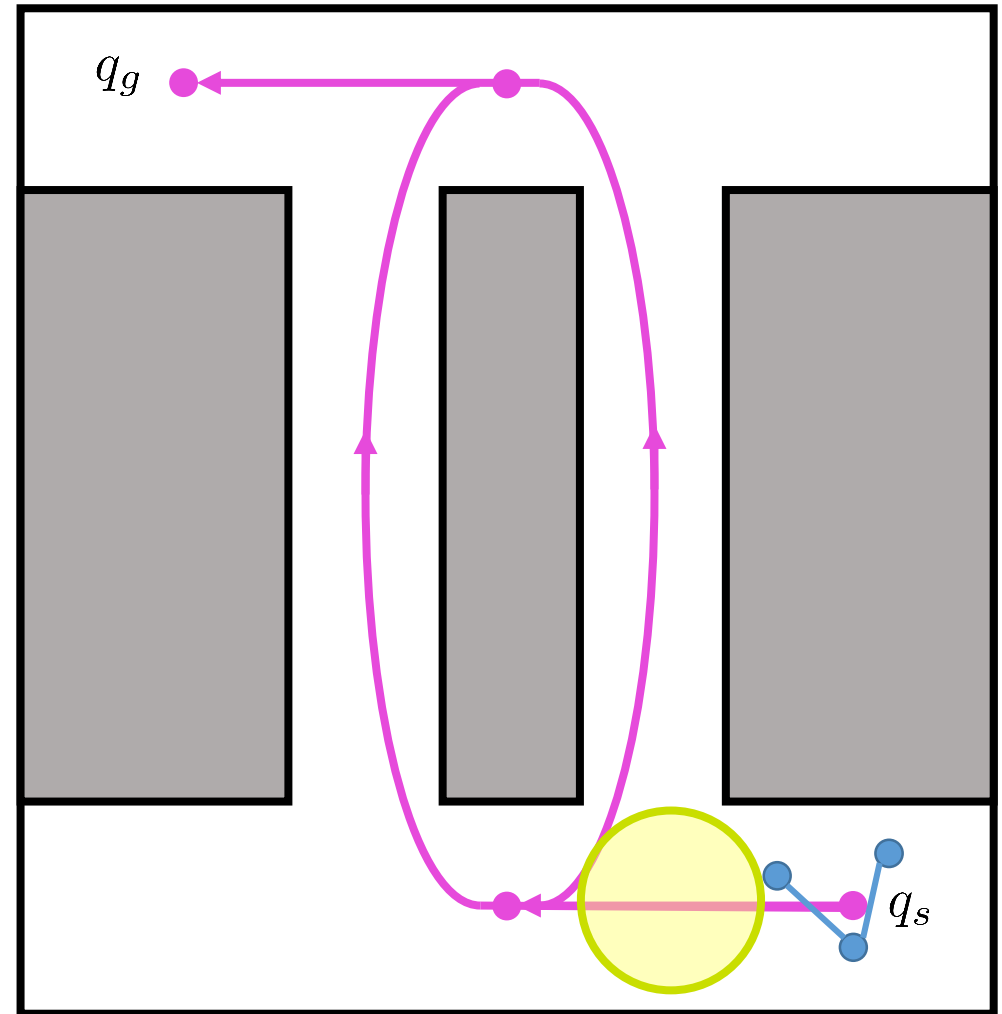
1. Region-biased RRT extension

\* Samples the region for a  $q_{rand}$  and then performs like any RRT method



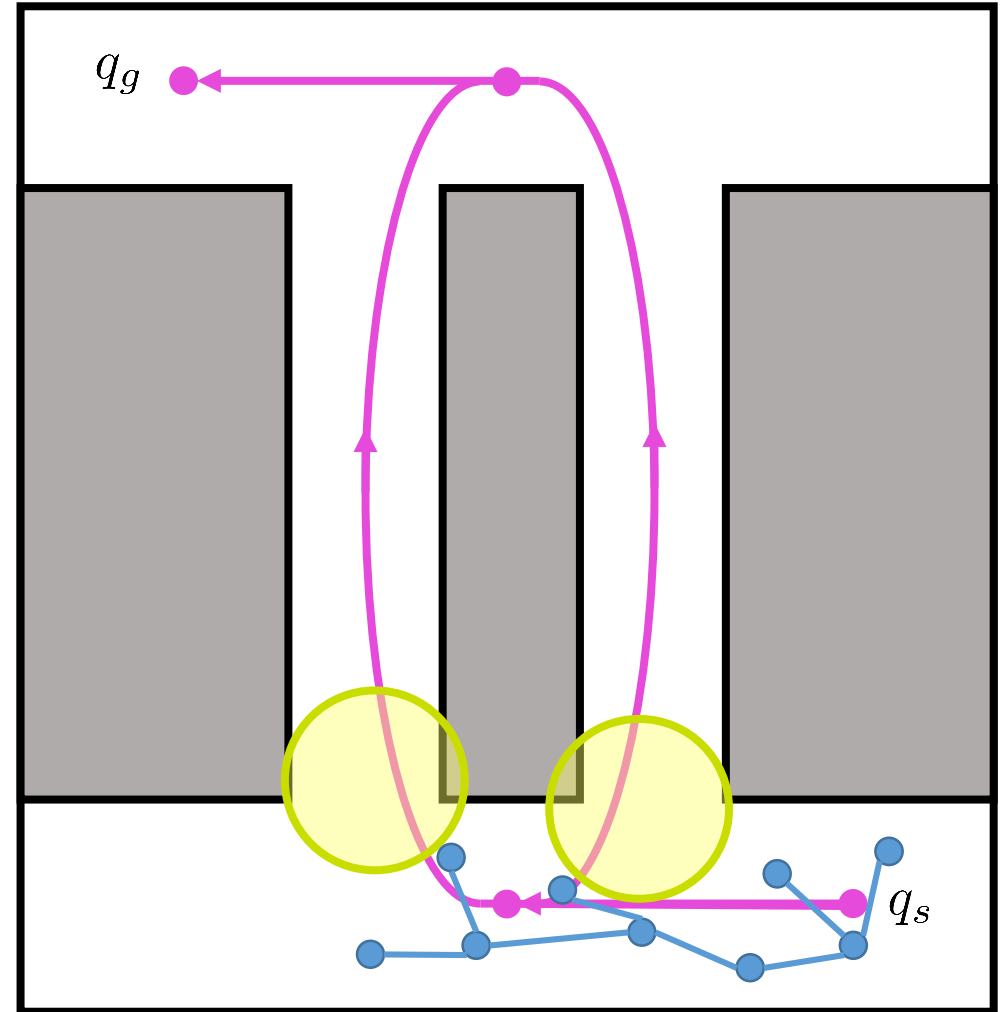
### 3. Region-biased RRT Growth

- Four steps
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  2. Advance regions along flow edges



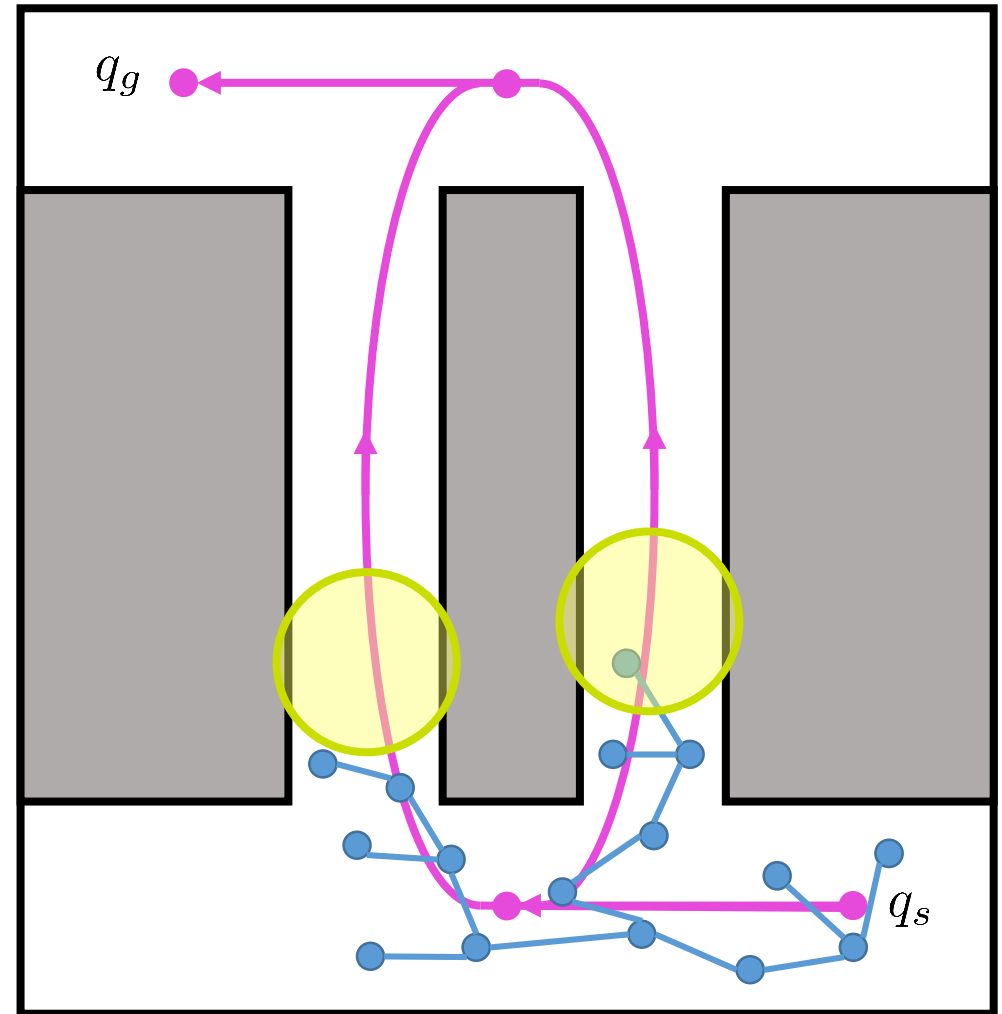
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  2. Advance regions along flow edges
  3. Delete useless regions(heuristic)
  4. Create new regions

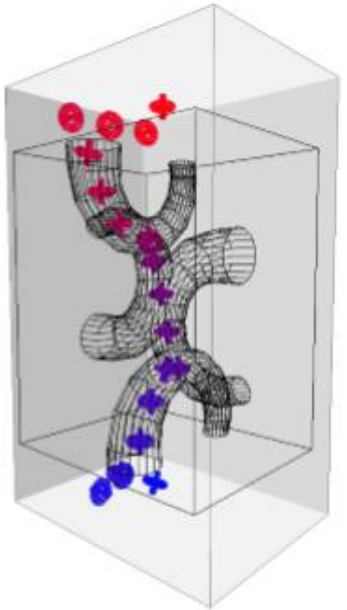


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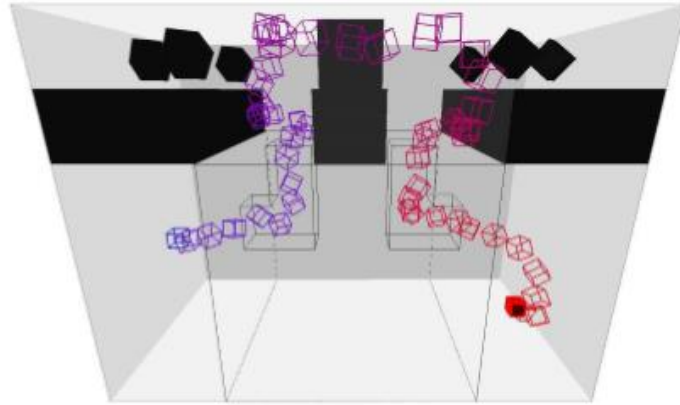
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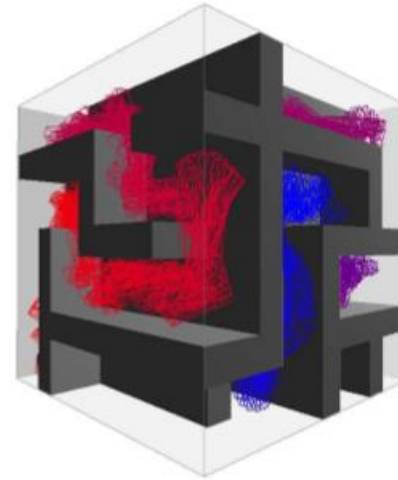
# Evaluation



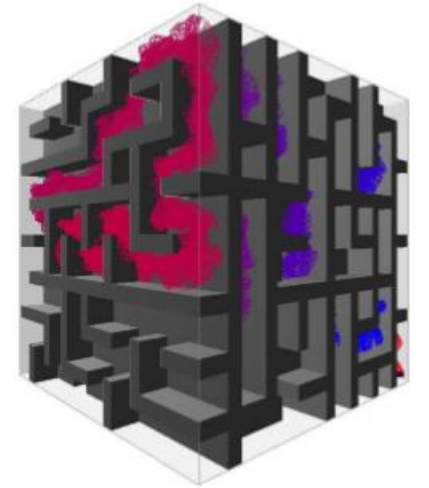
(a) MazeTunnel  
(toroidal plus)



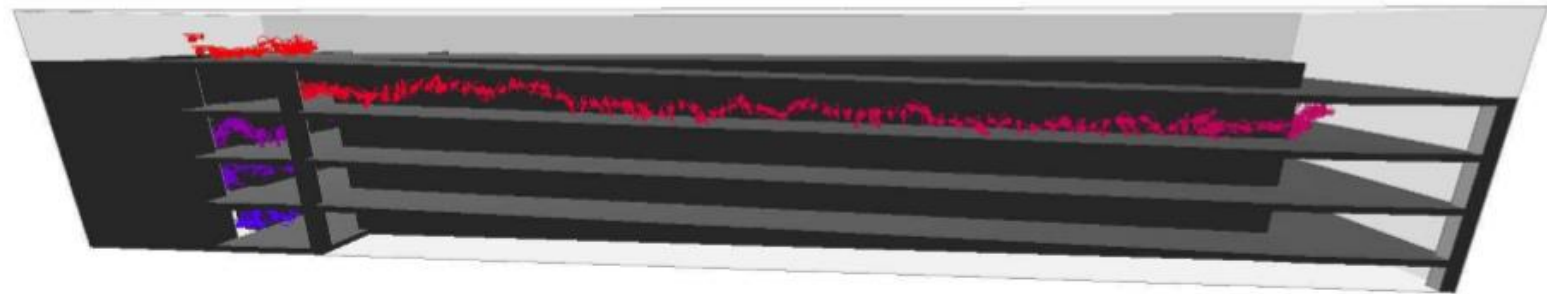
(b) LTunnel (box)



(d) GridMaze4 (stick)

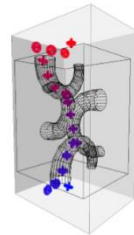
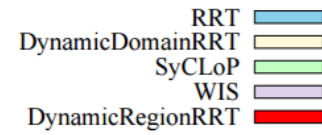


(e) GridMaze8 (stick)

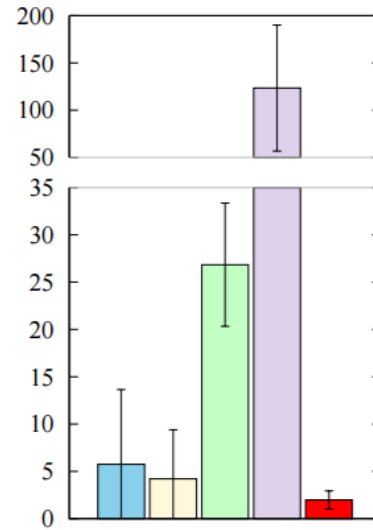


(c) Garage (helicopter)

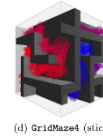
# Results on Holonomic



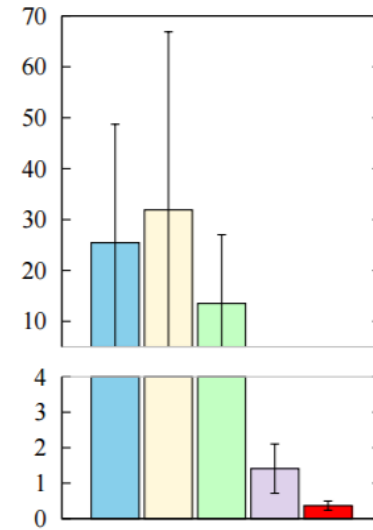
(a) MazeTunnel (toroidal plus)



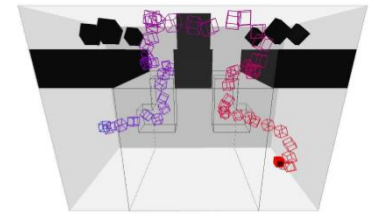
(a) MazeTunnel



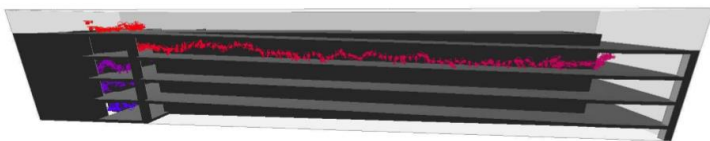
(d) GridMaze4 (stick)



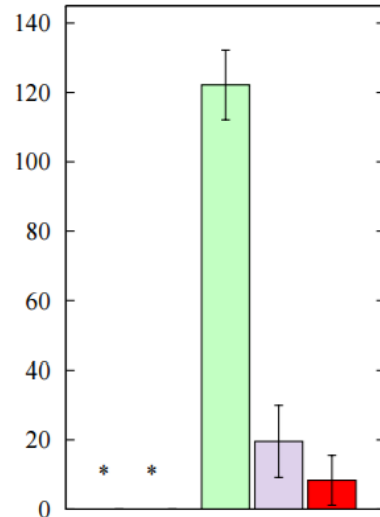
(b) LTunnel



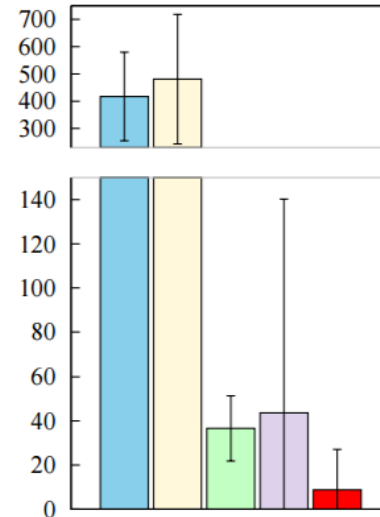
(b) LTunnel (box)



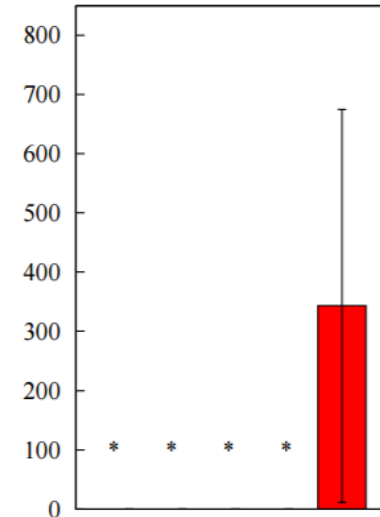
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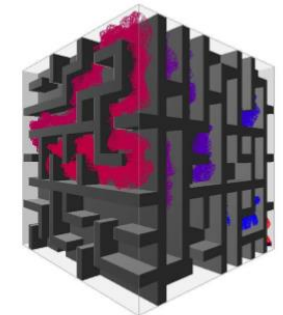
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(d) GridMaze4



(e) GridMaze8

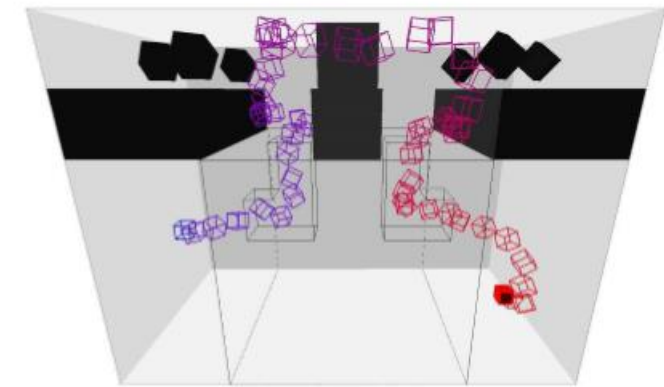
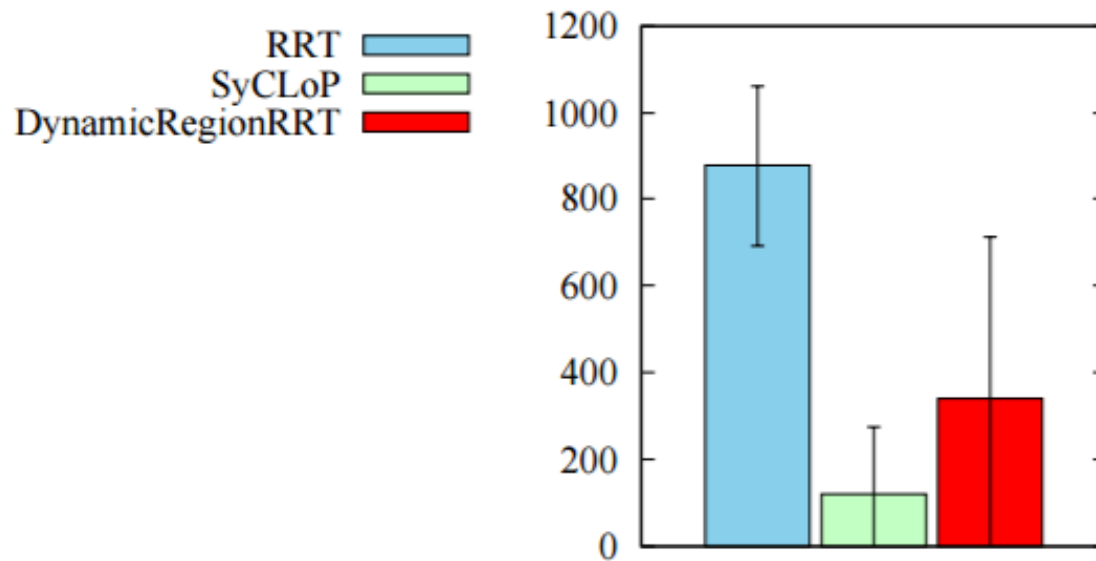


(e) GridMaze8 (stick)



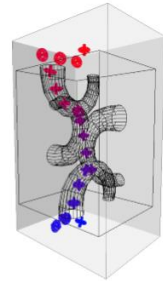
# Results on non-holonomic

- + Dynamic biased RRT works on non-holonomic problems
- SyClop performs better
  - \* SyClop has faster neighbor selection routine

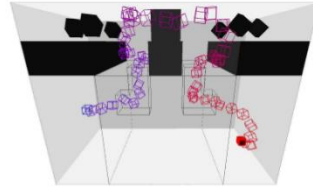


(b) LTunnel (box)

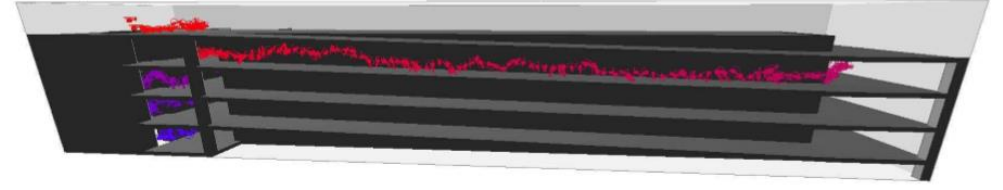
# Results



(a) MazeTunnel  
(toroidal plus)



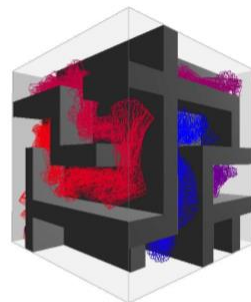
(b) LTunnel (box)



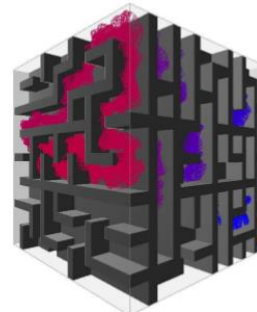
(c) Garage (helicopter)

**Table 1.** Success rates in each experiment.

Planner	DRRRT	RRT	Dynamic-Domain RRT	SyCLOP-RRT	WIS
MazeTunnel	100%	100%	100%	100%	100%
LTunnel	100%	100%	100%	100%	100%
Garage	100%	0%	0%	100%	100%
GridMaze4	100%	100%	100%	100%	100%
GridMaze8	76%	0%	0%	0%	0%
LTunnel (nonholonomic)	90%	24%	-	97%	-



(d) GridMaze4 (stick)



(e) GridMaze8 (stick)

# Q&A