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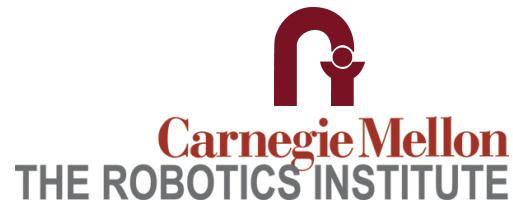
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# Planning Under Topological Constraints Using Beam-Graphs

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# Topological Constraints

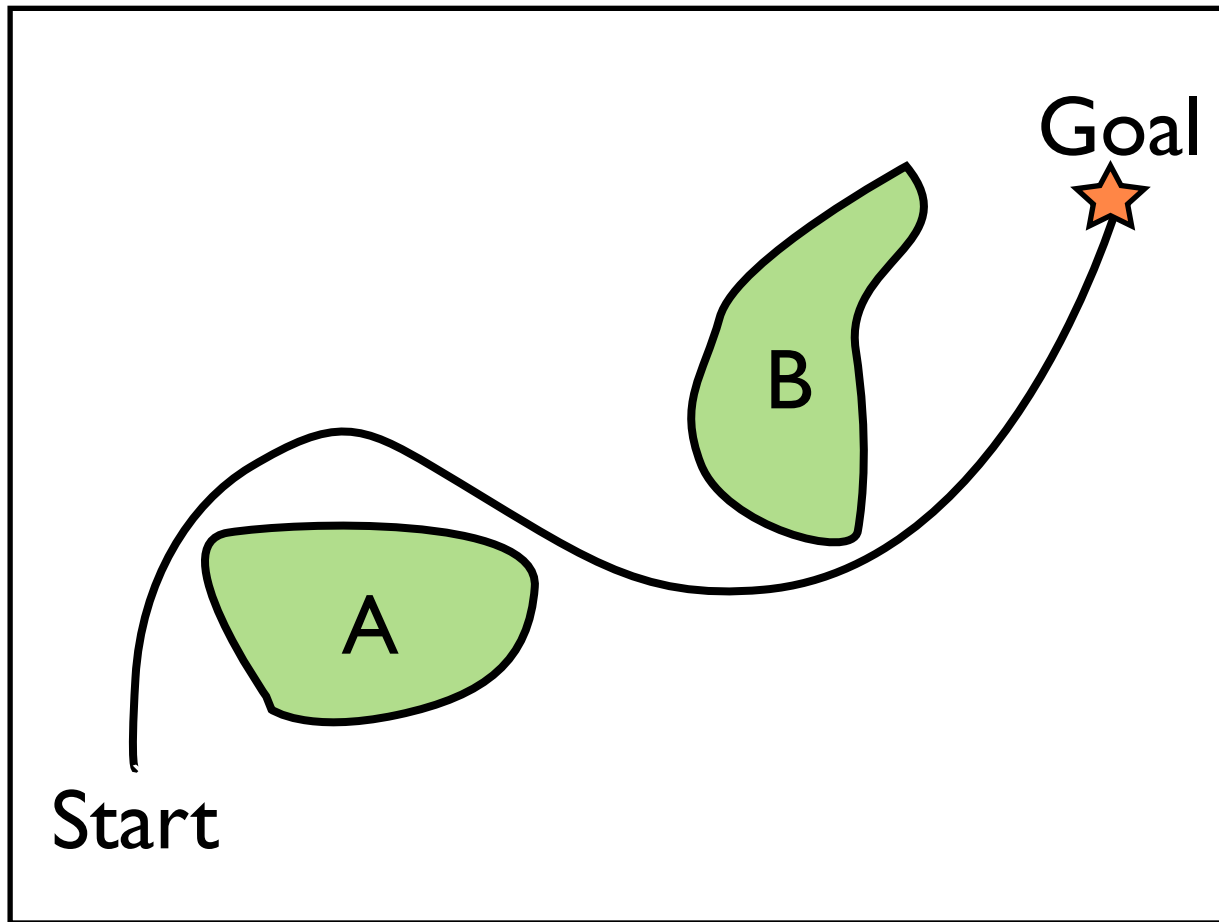
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“Find a circuit path for an UAV such that it obtains  $360^\circ$  views of certain regions of interest, in a particular order”

# Topological Constraints

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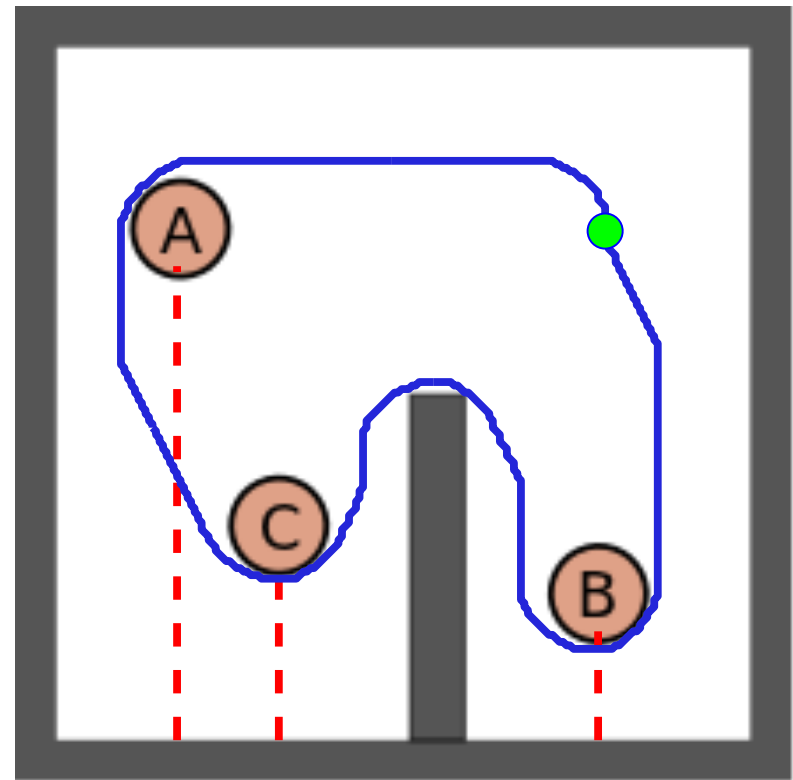
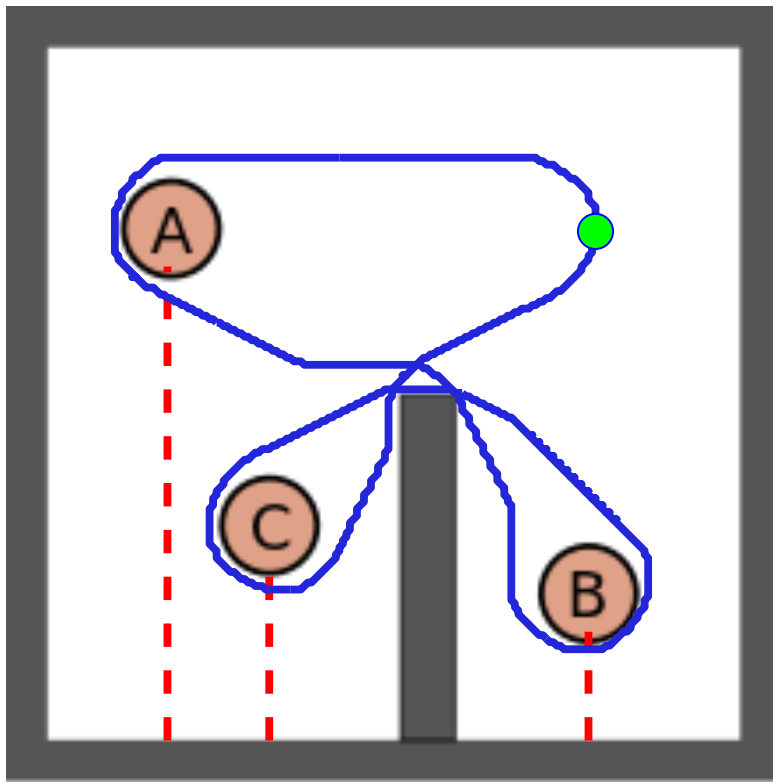


“Find the optimal path from start to goal such that it goes *above* region A and *below* region B”

# Topological Constraints

Find the optimal loop that encloses the regions of interest in some *specified order*

Find the optimal loop that encloses the regions of interest in *any* order

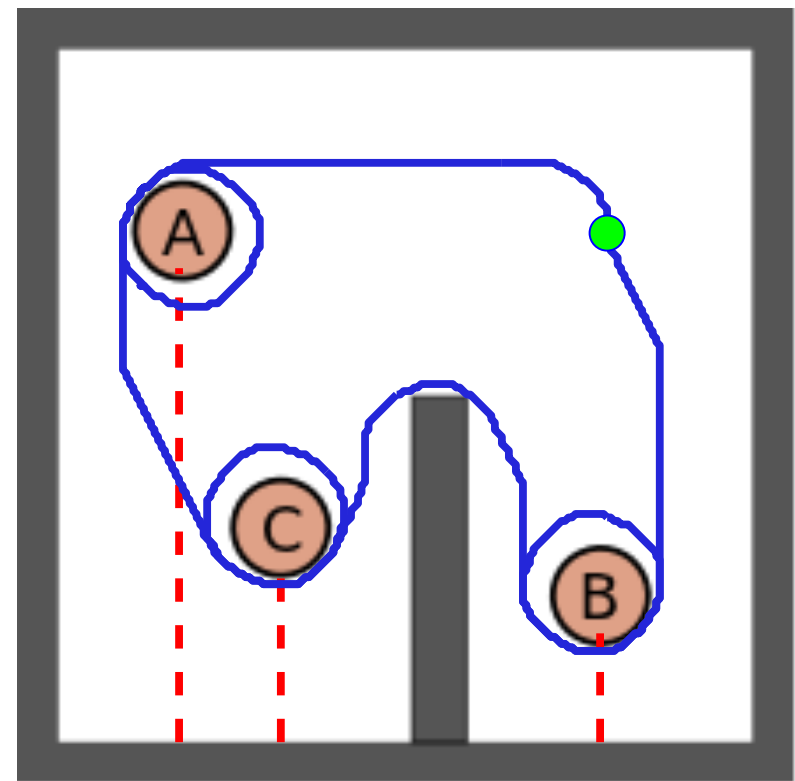
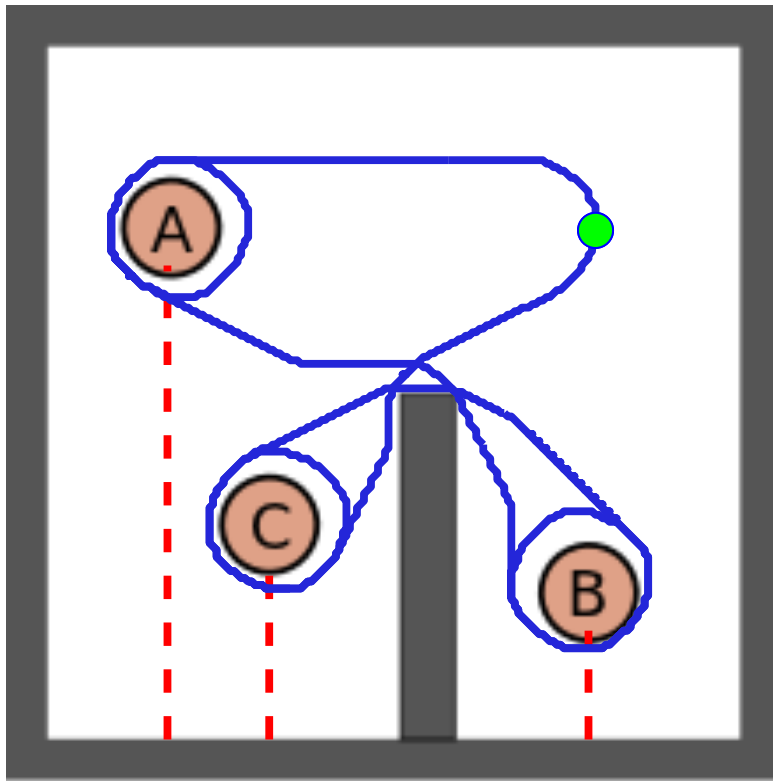


# Topological Constraints



Find the optimal loop that obtains  $360^\circ$  views of the regions of interest in some *specified order*

Find the optimal loop that obtains  $360^\circ$  views of the regions of interest in *any order*



# Related Work

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Methods inspired by complex analysis, electromagnetic theory and flow theory:

- S. Bhattacharya, M. Likhachev, and V. Kumar. *Topological constraints in search-based robot path planning*. Autonomous Robots, 2012
- P. Vernaza, V. Narayanan, and M. Likhachev. *Efficiently finding optimal winding-constrained loops in the plane*. In Proceedings of Robotics: Science and Systems, 2012
- H. Gong, J. Sim, M. Likhachev, and J. Shi. *Multihypothesis motion planning for visual object tracking*. In Thirteenth International Conference on Computer Vision, 2011

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Designed for “homology” constraints. Cannot handle general topology constraints

Mathematically and numerically intensive

# Related Work

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## Computational geometry approaches:

- S. Cabello, Y. Liu, A. Mantler, and J. Snoeyink. Testing homotopy for paths in the plane. In Proceedings of the eighteenth annual symposium on Computational Geometry, 2002
- A. Efrat, S. Kobourov, and A. Lubiw. Computing homotopic shortest paths efficiently. Computational Geometry



# Related Work

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Not easily applicable to robotics--difficult to incorporate kinodynamic constraints

Cannot handle arbitrary cost functions



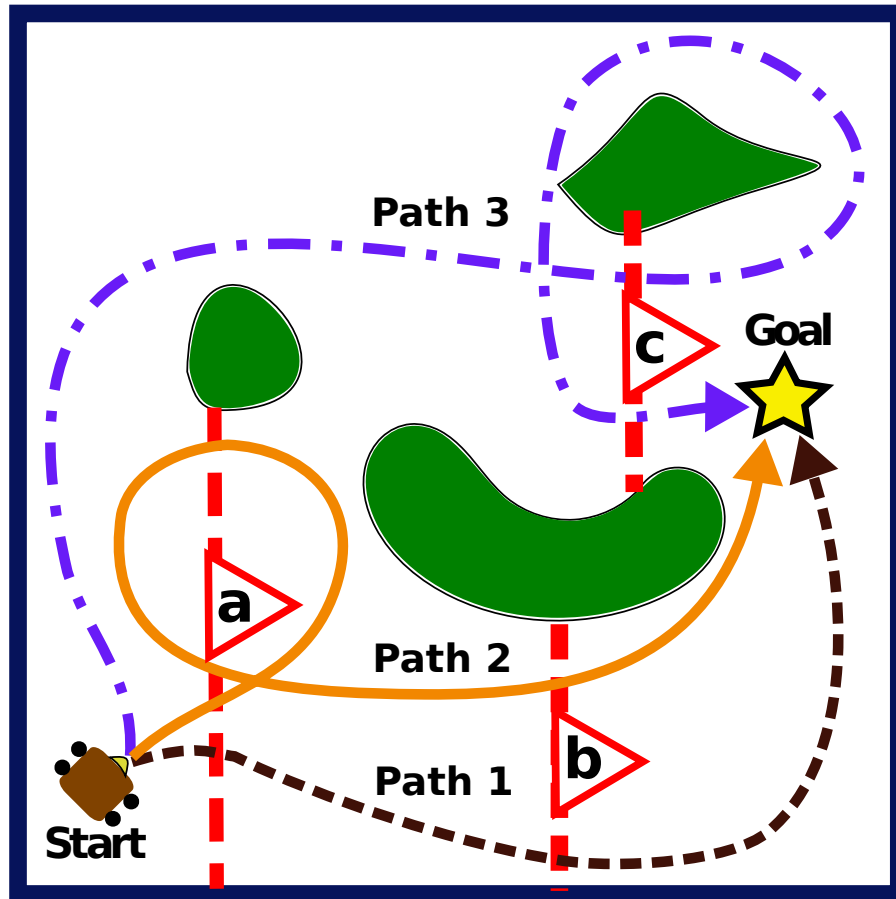
## Idea of ‘virtual beams’:

B. Tovar, F. Cohen, and S. M. LaValle. *Sensor beams, obstacles, and possible paths*. In G. Chirikjian, H. Choset, M. Morales, and T. Murphey, editors, *Algorithmic Foundations of Robotics, VIII*

“Virtual beams” construction - captures topological information, intuitive

Our work shows how virtual beams can be integrated into existing search-based motion planning frameworks for robotics

# Beam-Graph Construction



Path 1: ab

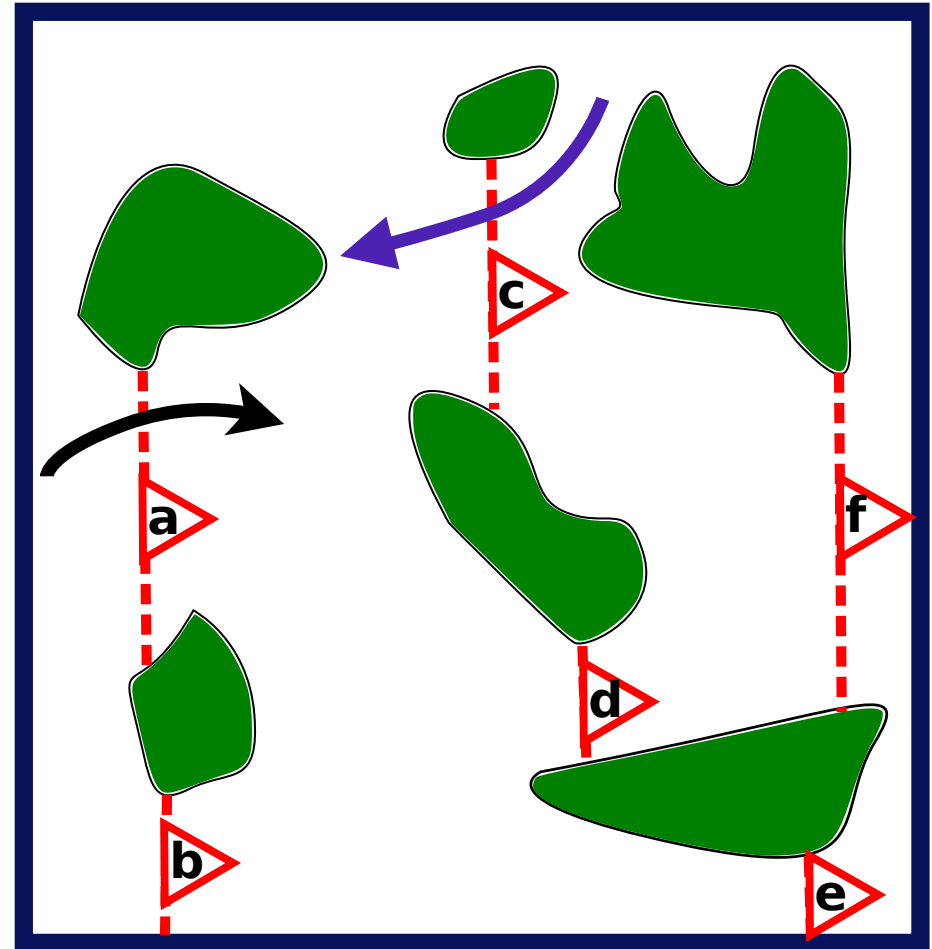
Path 2: aa'ab

Path 3: cc

- Sequences of beam-crossings capture 'topological' structure
- Hallucinate 'virtual' beams to differentiate topologically different paths

# Beam-Graph Construction

- For every region of interest, construct a beam starting at the *lowest* point on the ROI, and terminating at another ROI, or the boundary
- Beams are directed



Beam crossing: **a**

Beam crossing: **c'**

# Beam-Graph Construction

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A state in the graph:  $s = [\mathbf{x}(s) \ b(s)]$

Spatial configuration of the robot

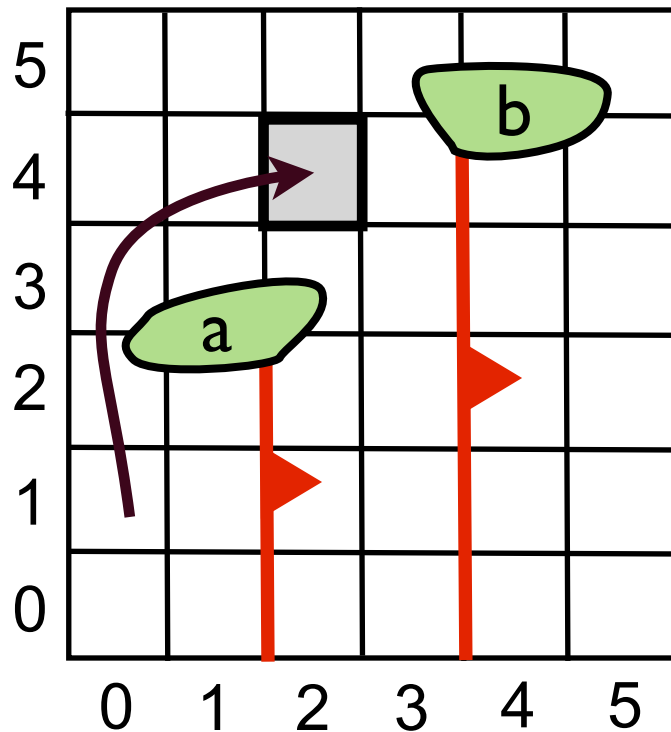
(e.g:  $\mathbf{x}(s) = (x \ y \ \theta)$ )

History of beam crossings

(e.g:  $b(s) = aabc'de'$ )

# Beam-Graph Construction

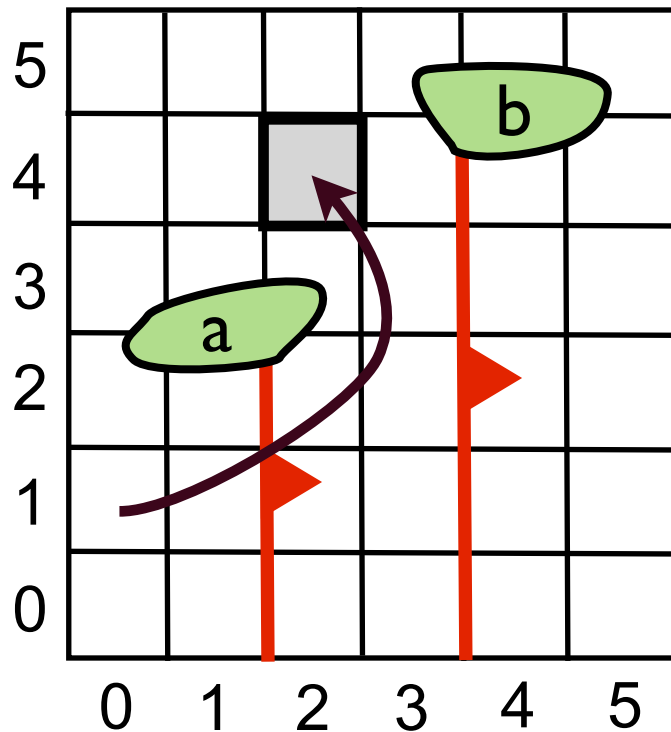
A state in the graph:  $s - [\mathbf{x}(s) \ b(s)]$



$(2, 4, \epsilon)$

# Beam-Graph Construction

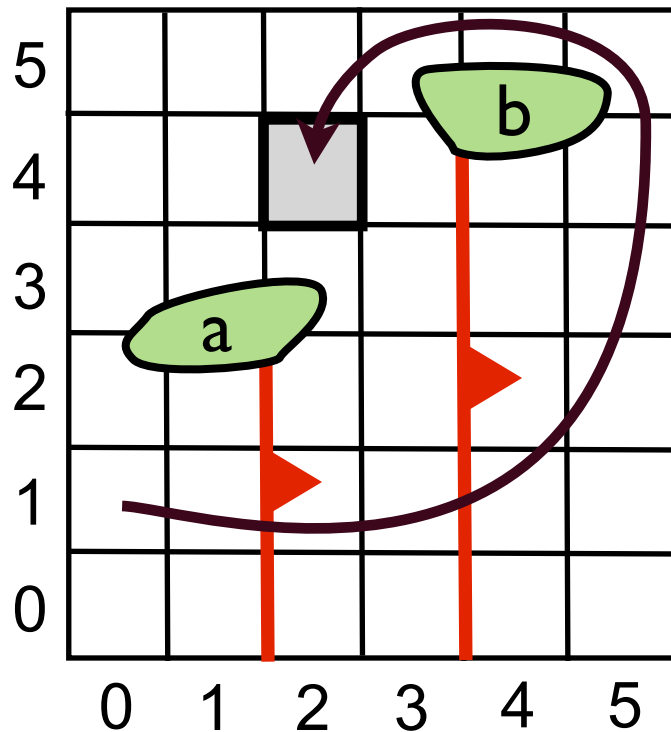
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$(2, 4, a)$

# Beam-Graph Construction

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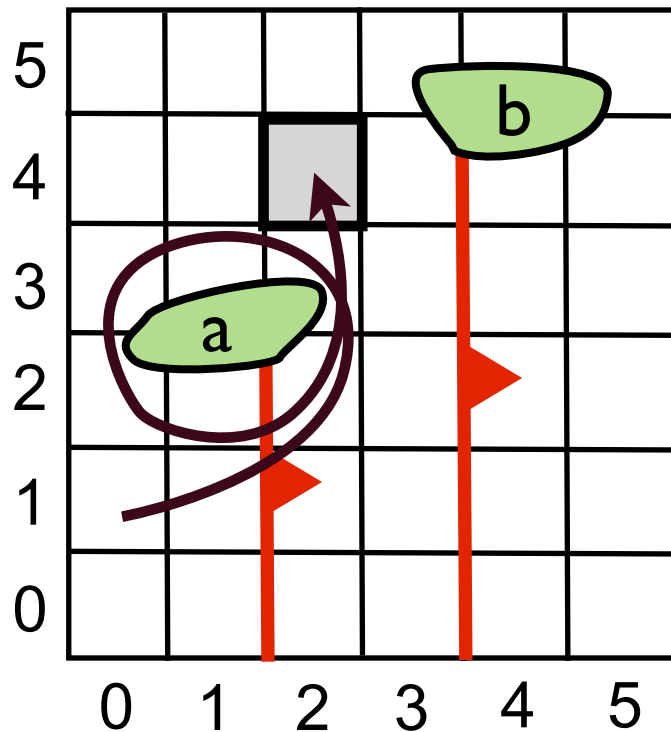


(2, 4, ab)



# Beam-Graph Construction

A state in the graph:  $s - [\mathbf{x}(s) \ b(s)]$



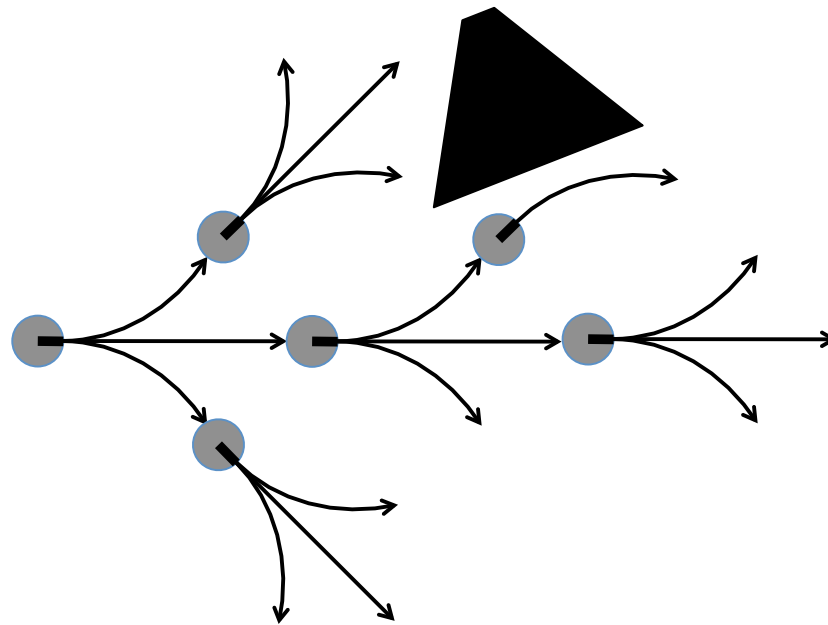
(2, 4, aa)

# Beam-Graph Construction

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A state  $s'$  is a successor of  $s$  iff.:

- There exists a kinodynamically feasible motion primitive between  $s$  and  $s'$
- $b(s')$  is a concatenation of  $b(s)$  and the string of beam crossings formed by the motion primitive, i.e,  $b(s') = b(s) + w(s,m)$

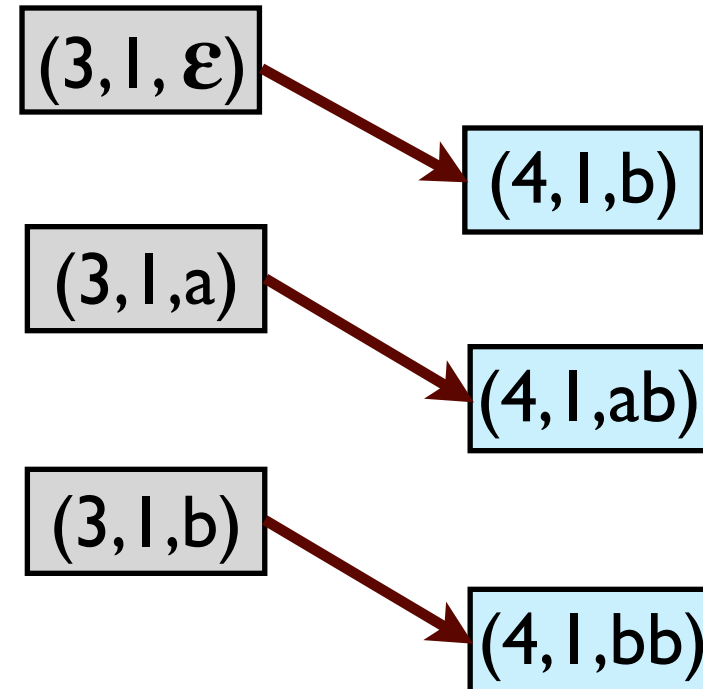
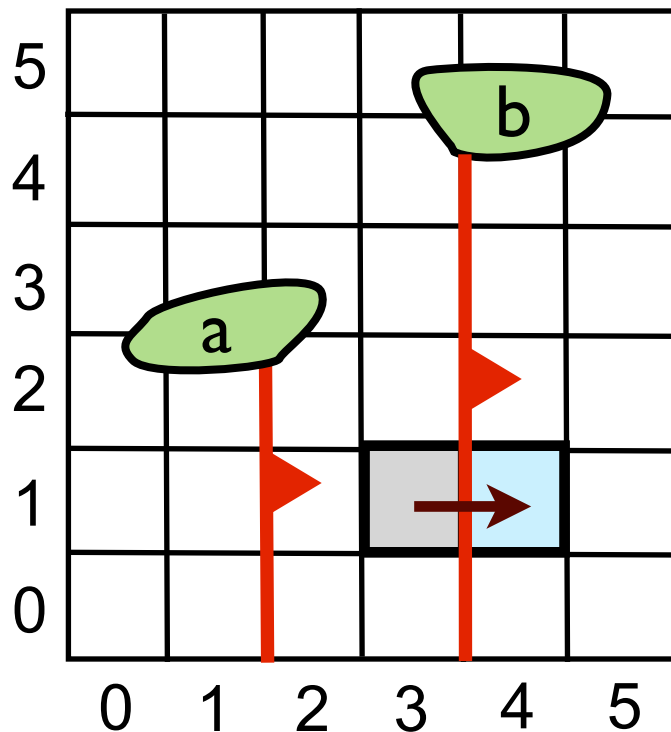




# Beam-Graph Construction

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# Formalizing Topological Constraints

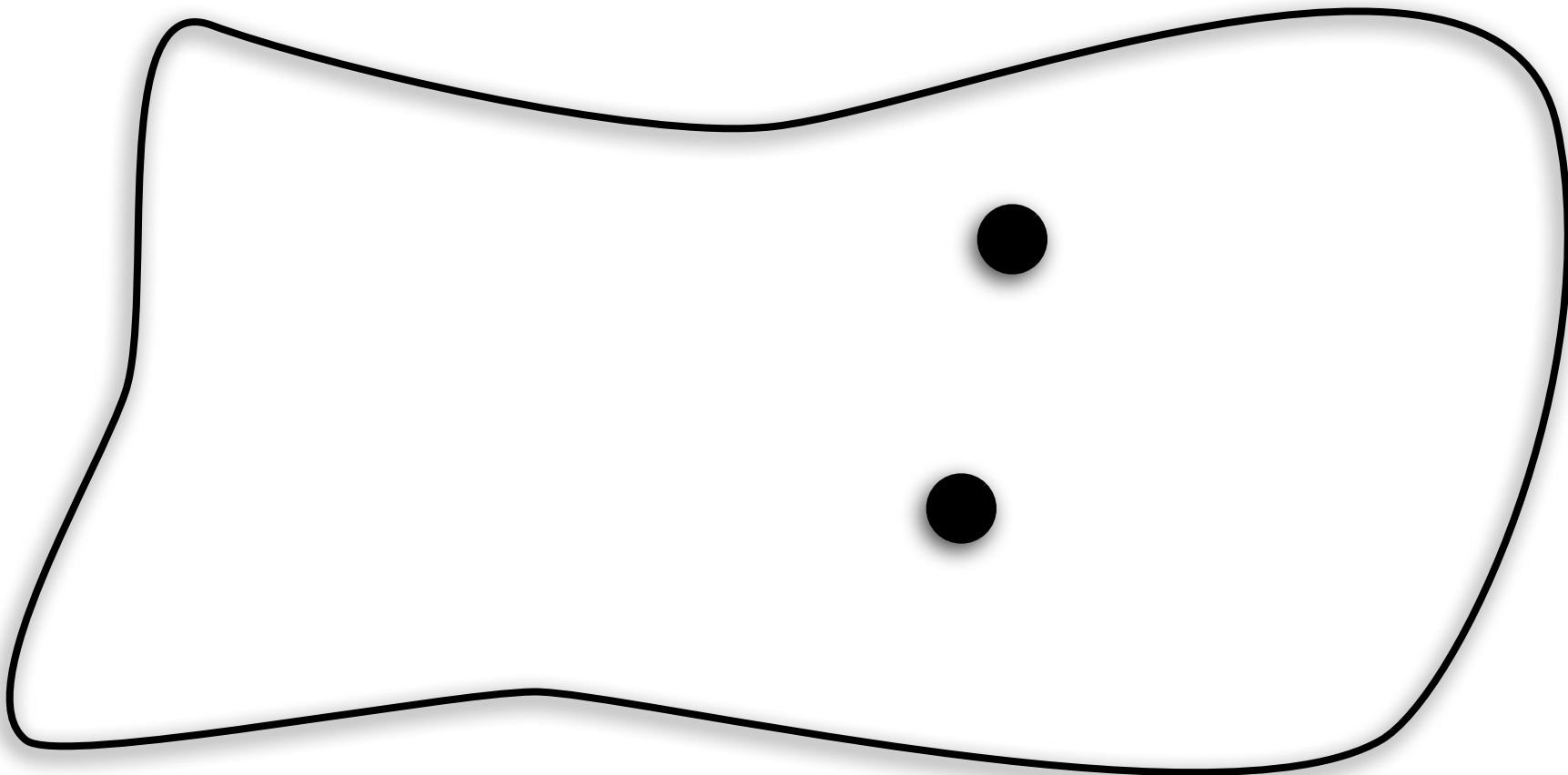
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For a topological space  $X$ , the set of all loops based at some  $x_0 \in X$ , is the first homotopy group or the fundamental group

# Formalizing Topological Constraints

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The multi-punctured plane

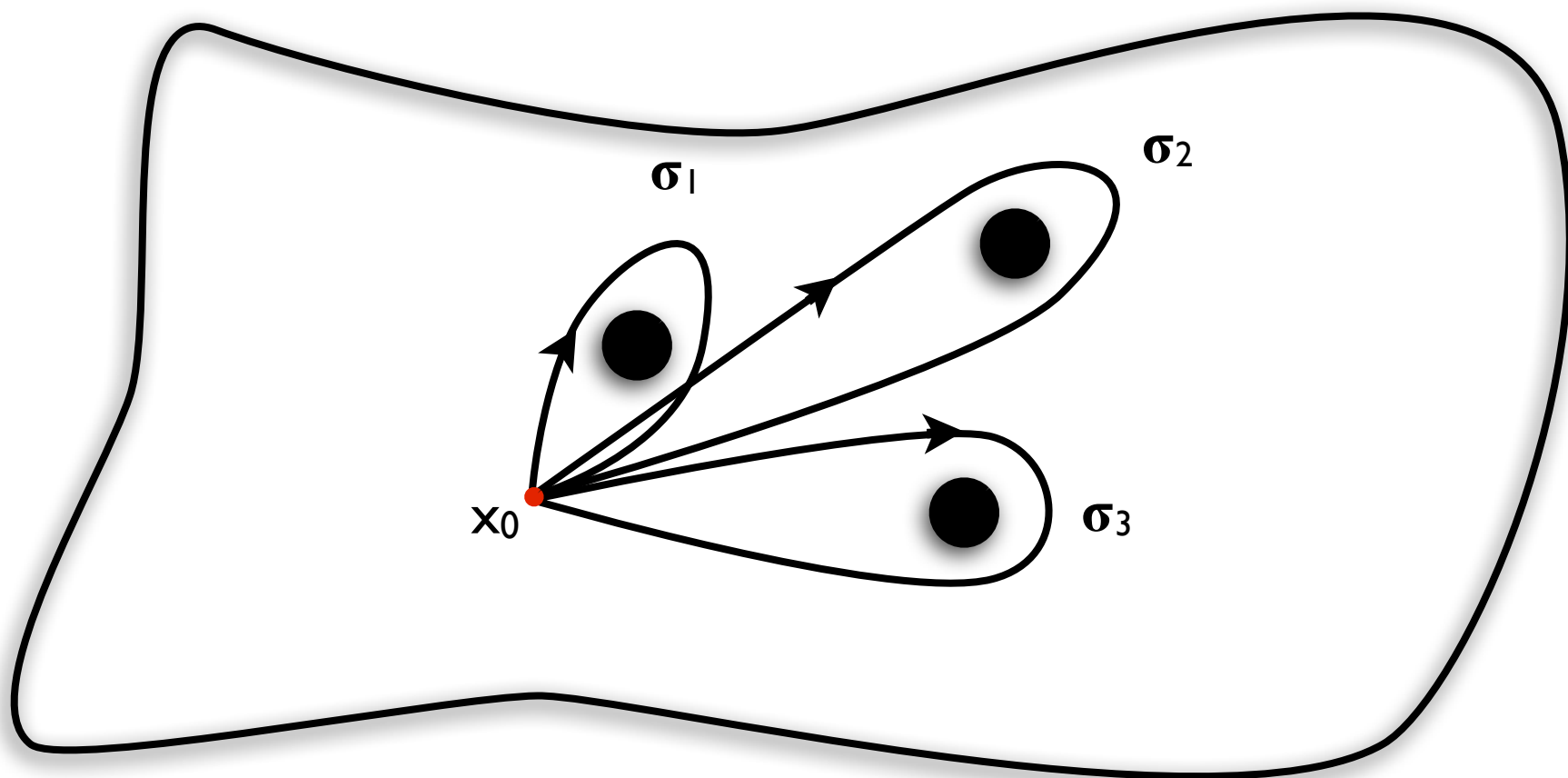


# Formalizing Topological Constraints

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The multi-punctured plane

For the multi-punctured plane, the fundamental group is the *free group on  $n$  letters*,  $F_n$



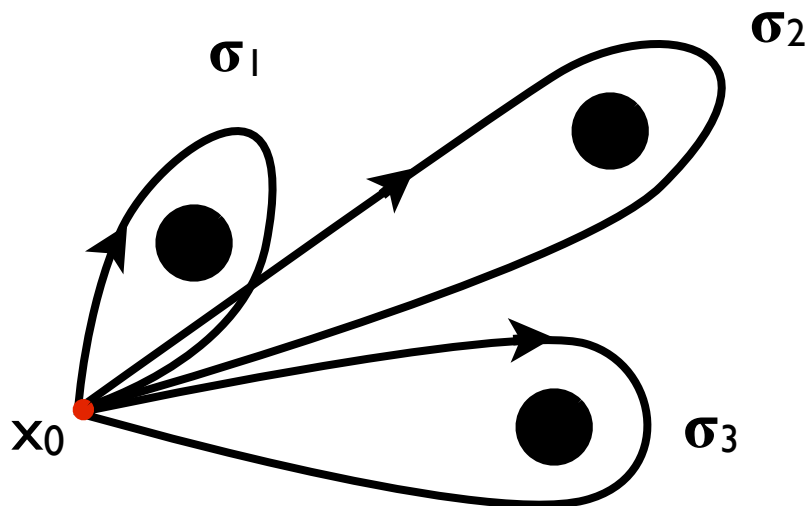
# Formalizing Topological Constraints

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The multi-punctured plane

For the multi-punctured plane, the fundamental group is the *free group on  $n$  letters*,  $F_n$

“Free group” because there are no relations, other than the group axioms



$$\mathcal{L} = \{\sigma_1, \sigma_2, \sigma_3, \sigma_1^{-1}, \sigma_2^{-1}, \sigma_3^{-1}, \varepsilon\}$$

$$F_3 = \{\text{All words formed from letters in } \mathcal{L}\}$$

# Formalizing Topological Constraints

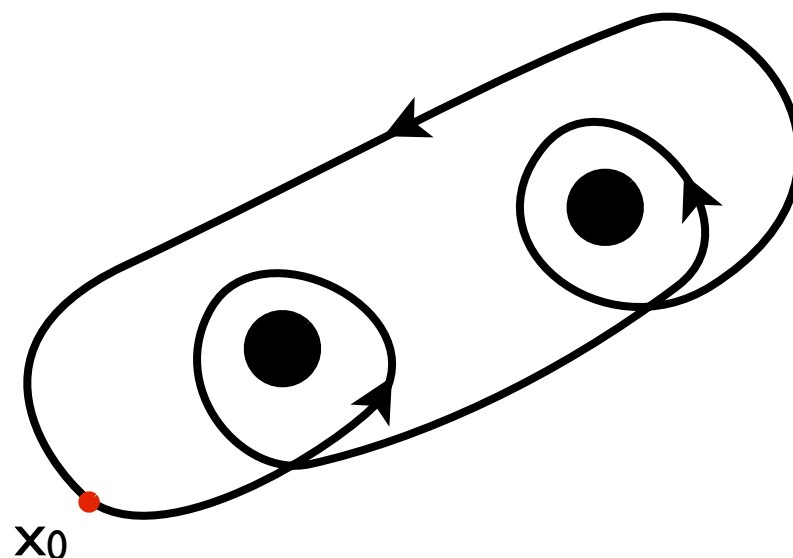
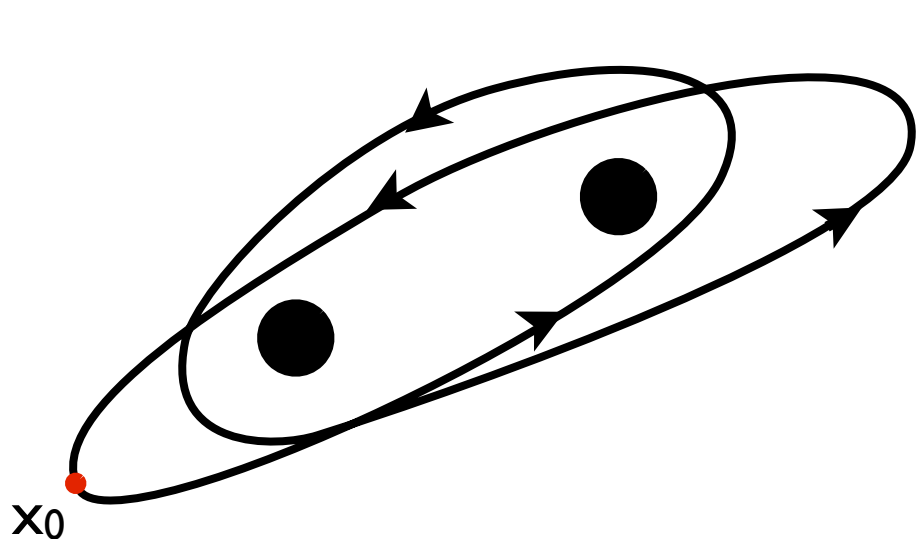
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## Homology

Same as the homotopy group, but also satisfies commutative property

Eg:  $\sigma_1\sigma_2$  and  $\sigma_2\sigma_1$  belong to the same homology group, whereas they belong to different homotopy groups

Homology constraints are **winding constraints**





# Formalizing Topological Constraints

	Homotopy	Homology
Identity	Yes	Yes
Inverse	Yes	Yes
Commutativity	No	Yes

Identity

$$\sigma_i \varepsilon = \varepsilon \sigma_i = \sigma_i$$

Inverse

$$\sigma_i \sigma_i^{-1} = \sigma_i^{-1} \sigma_i = \varepsilon$$

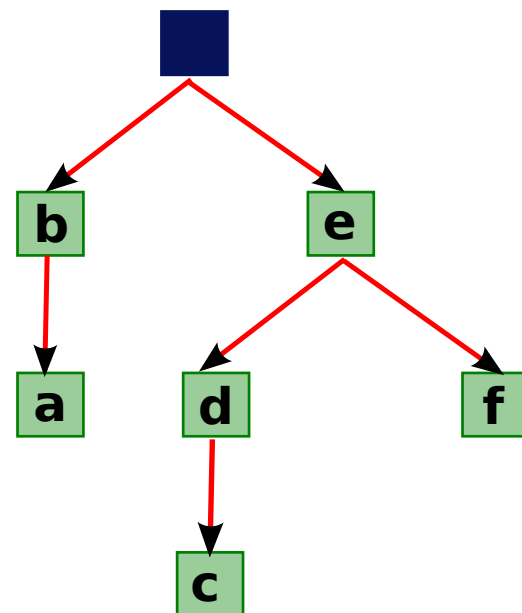
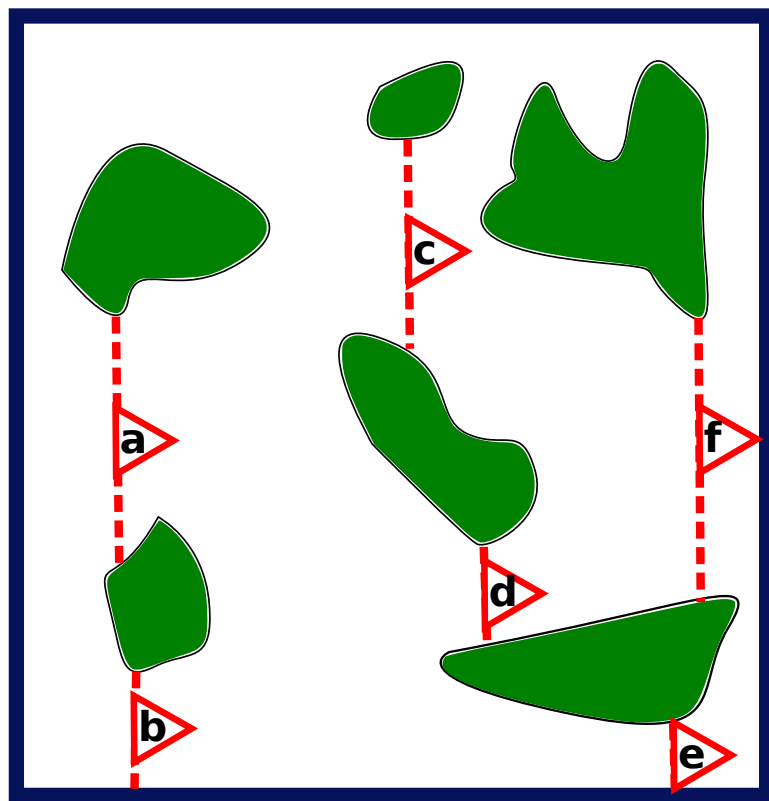
Commutativity

$$\sigma_i \sigma_j = \sigma_j \sigma_i$$

# Relating Beam Crossings and Topology

How do beam crossings relate to homotopy and homology?

Recollect construction of virtual beams



# Relating Beam Crossings and Topology

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Spanning tree ensures “minimally sufficient collection of sensor beams”

Mapping from beam crossings to elements of  $F_n$

Beam Crossings

a      a'  
b'    b  
      ⋮  
x      x'



Letters of  $F_n$

$\sigma_1$      $\sigma_1^{-1}$   
           $\sigma_2$   
 $\sigma_2^{-1}$   
      ⋮  
 $\sigma_n$      $\sigma_n^{-1}$

# Relating Beam Crossings and Topology

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Applying equivalence relations on the string of beam crossings yields corresponding topological constraints

Inverse

$$aa' \sim a'a \sim \varepsilon$$

Commutativity

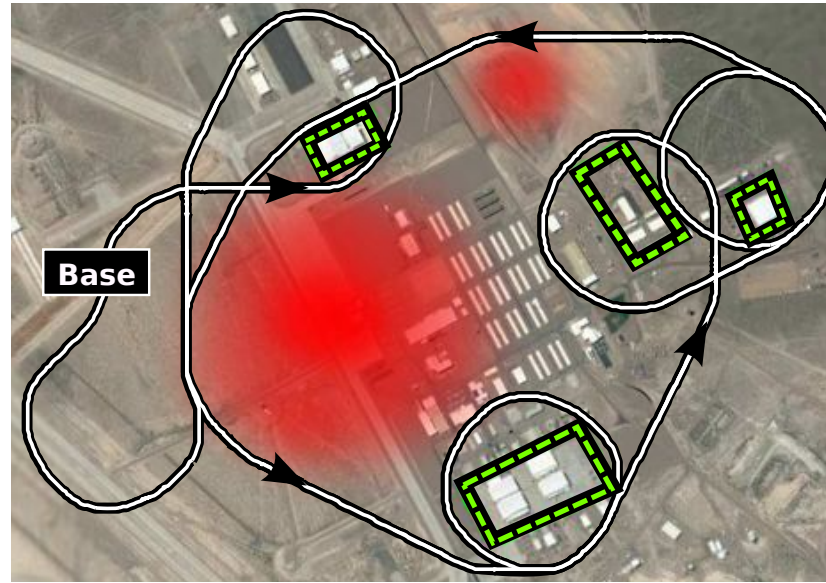
$$ab \sim ba$$

Example reduction:  $b(s) = abcc'b'ca'$

Inverse (Homotopy):  $abcc'b'ca' \sim abb'ca' \sim \mathbf{aca'}$

Inverse and Commutativity (Homology):  $abcc'b'ca' \sim abb'ca' \sim aca' \sim aa'c \sim \mathbf{c}$

# Relating Beam Crossings and Topology



“Find a circuit path for an UAV such that it obtains  $360^\circ$  views of  $n$  regions of interest, in a particular order”



“Find a loop in the  $n$ -punctured plane, that belongs to a particular element of the fundamental group  $F_n$ ”

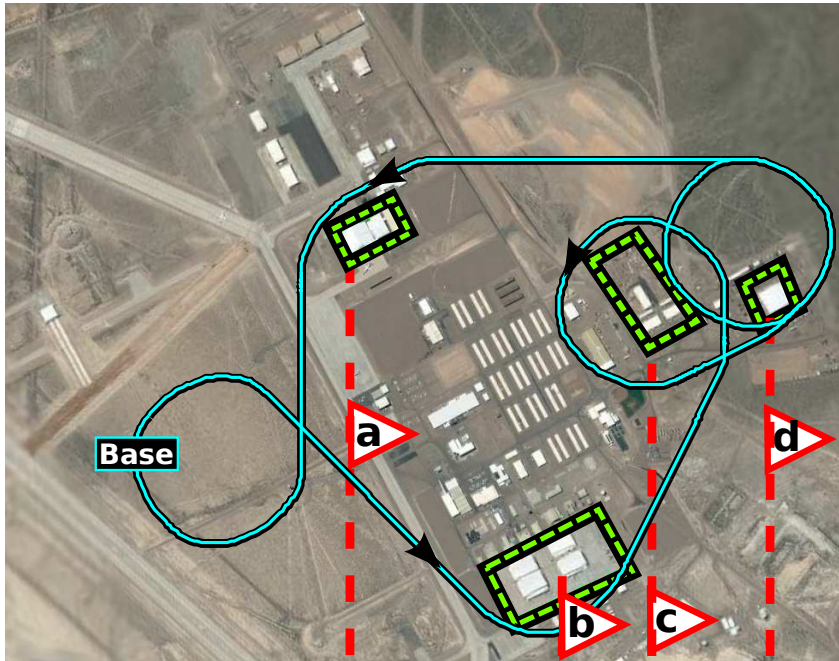


“Find a loop that has a particular sequence of beam crossings”



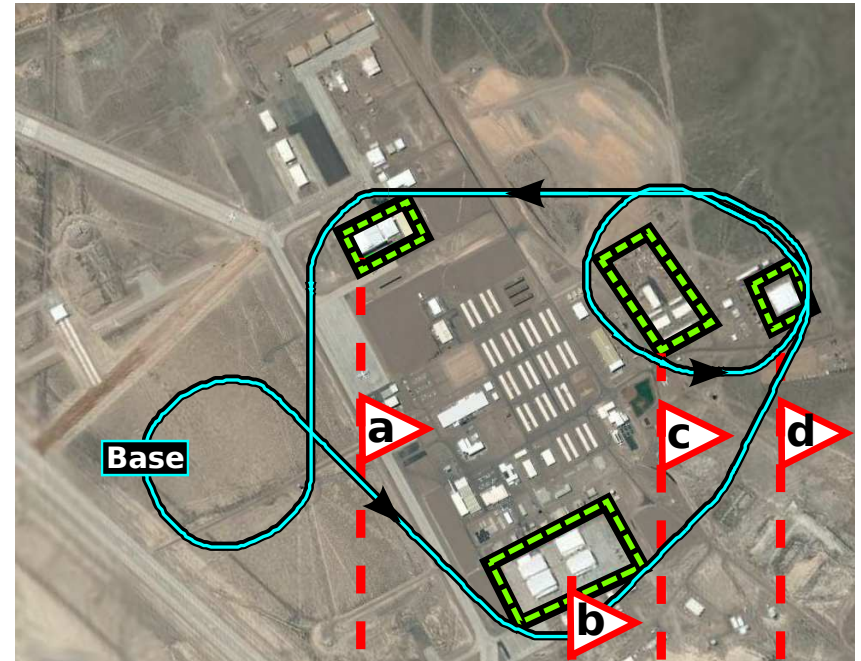
# Homotopy vs Homology

Goal string: **abccdd**



Homotopy

Order matters



Homology

Order does not matter

# Experiments

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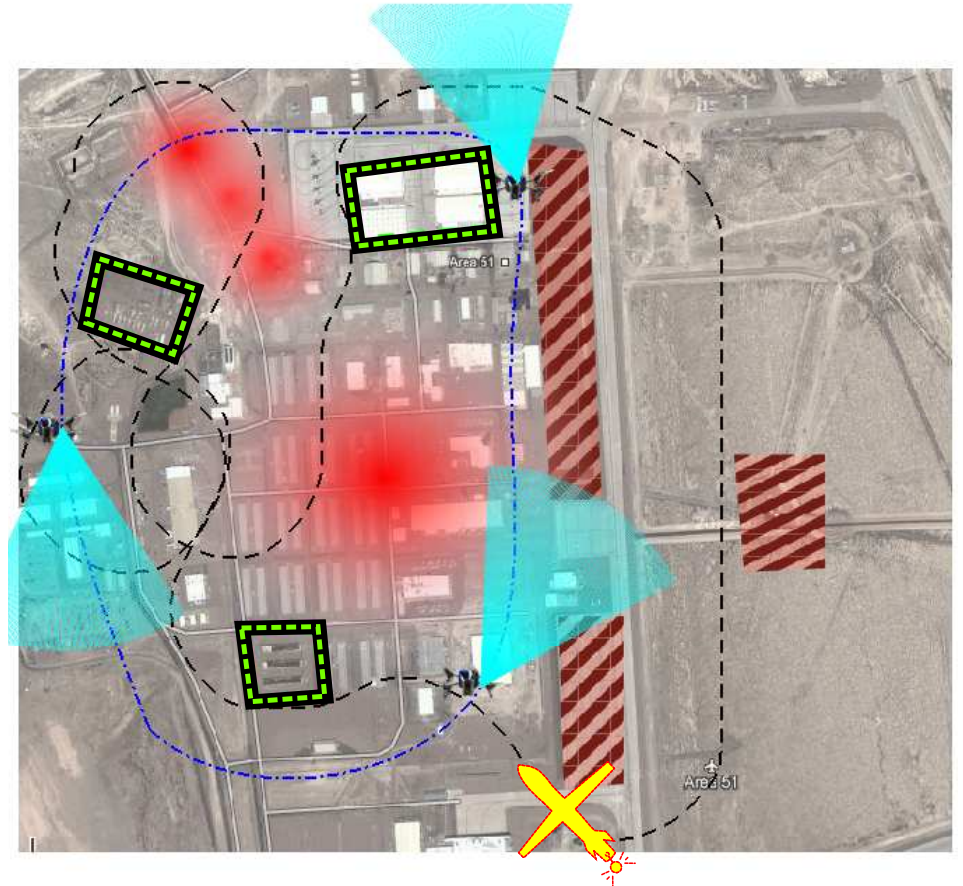
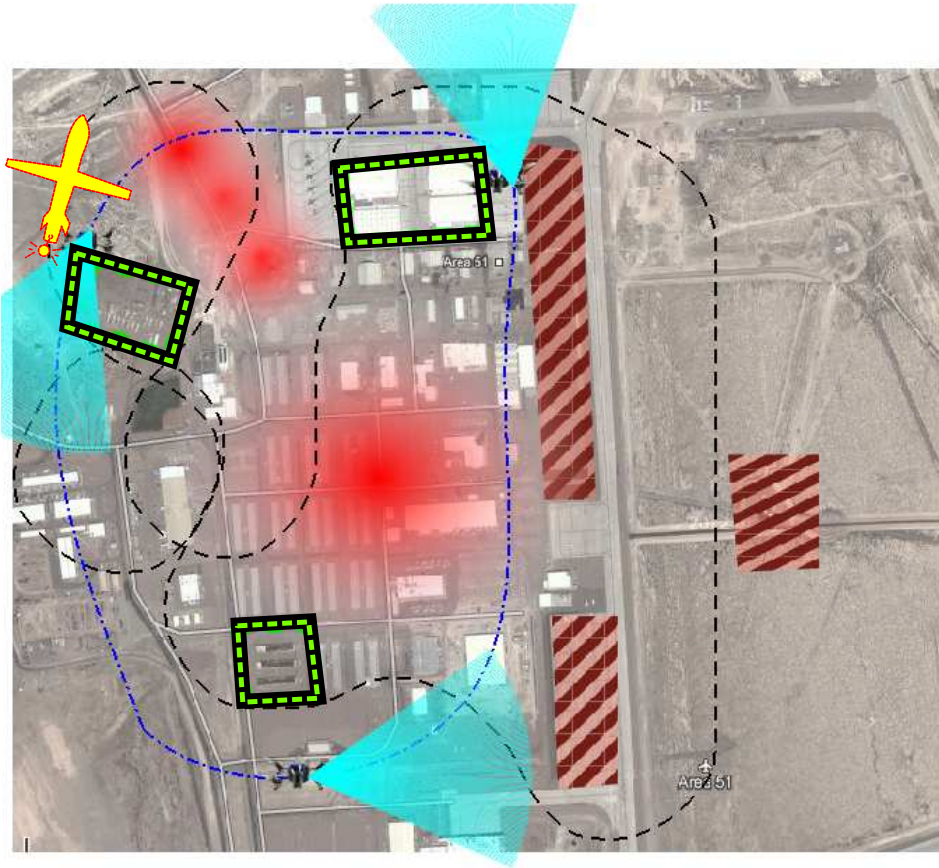
## UAV surveillance in dynamic environments

- Gather information about ROI in the environment
- Avoid hostile patrollers
- 5D  $(x, y, \theta, t, b)$  planning problem
- A\* search
- 2D  $(x, y)$  Dijkstra search to precompute admissible heuristics
- Cost function: Length of the path + Risk associated with getting close to a radar installation



# Experiments

# UAV surveillance in dynamic environments



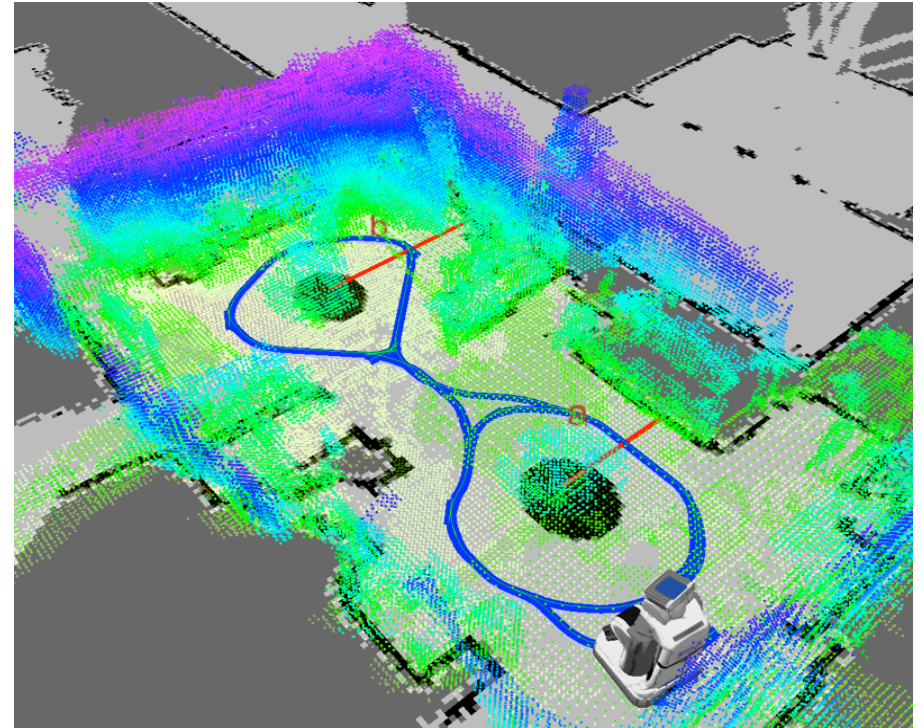


# Experiments

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## Loop planning for object modeling

- Obtain 3D models of objects in partially structured environments
- Mobile robot equipped with RGB-D sensor circumnavigates areas of interest
- 4D  $(x, y, \theta, b)$  planning problem





# Experiments

## Scaling Experiments

