

# Routing Air Traffic Flows: from Continuous to Discrete and Back

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joint work with

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# Geometric Shortest Paths

- Given:

Polygonal domain  $P$

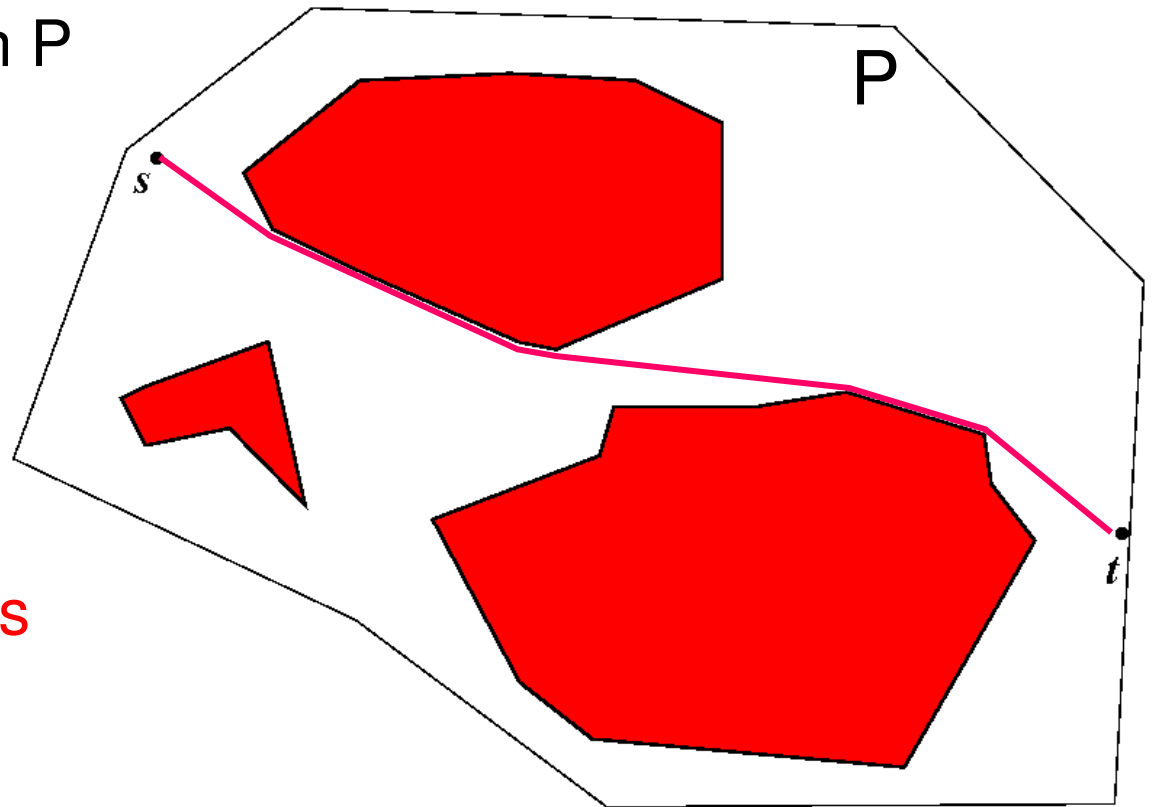
obstacles (holes)

Points  $s$  and  $t$

- Find:

shortest  $s$ - $t$  path

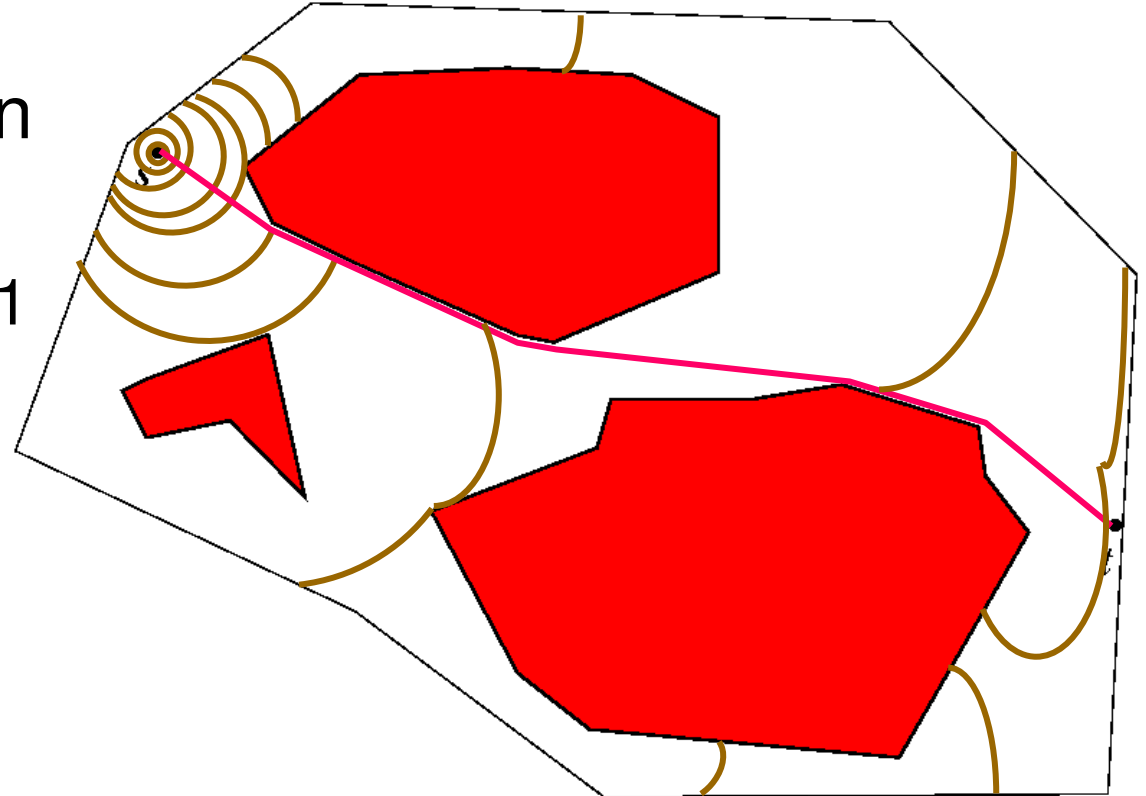
avoiding obstacles



# Continuous Dijkstra

[Mitchell'86]

- **Wave** propagation
  - starts from  $s$
  - travels at speed 1
- **Wavefront** at  $\tau$ 
  - bd of what's reached by  $\tau$



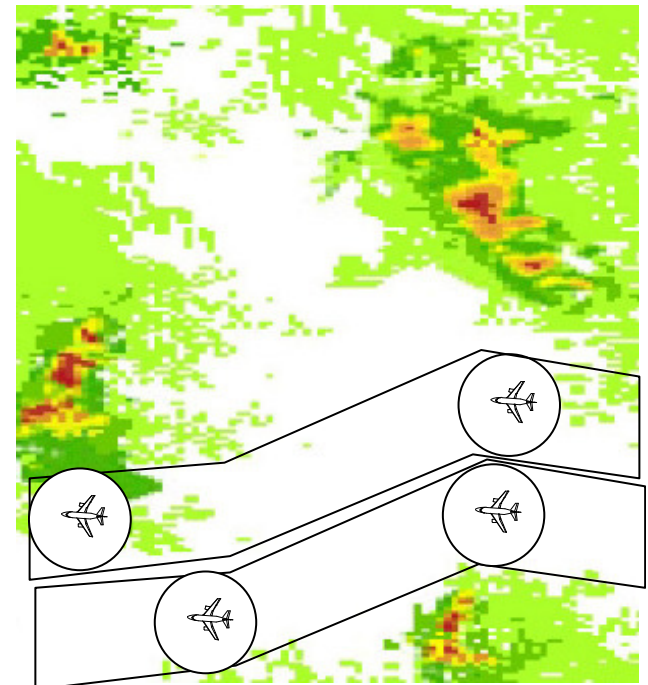
| SP from  $s$  to  $t$  | =  
time when **wavefront** hits  $t$

# Applications

- VLSI
- Robotics
- Sensor networks
- Air Traffic Management  
– **safety margin**

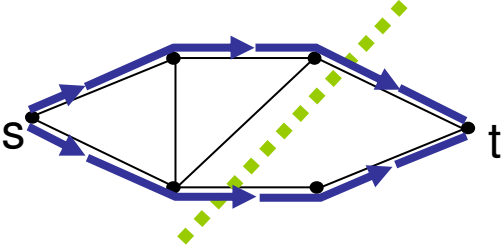
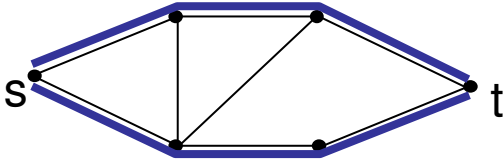
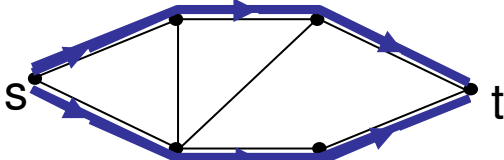
Multiple disjoint  
“**thick**”  
paths

*How to find thick paths  
in  
a polygonal domain?*



# Disjoint Paths in Graphs

## Related to Network Flows

<p>MaxFlow/MinCut Theorem</p>		<p>maxflow = mincut 2 = 2</p>
<p>Menger's Theorem</p>		<p>max # of disjoint s-t paths = min # of vertices to disconnect s and t 2 = 2</p>
<p>Flow Decomposition Theorem</p>		<p>flow = union of paths</p>

**Flows and Paths  
in  
Geometric Domains**

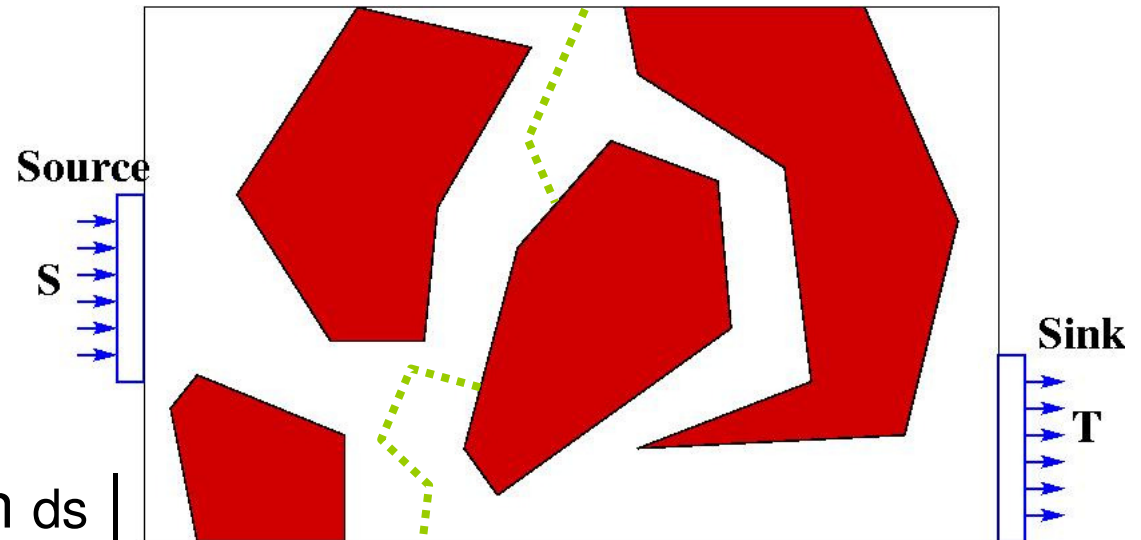
# MaxFlow: Problem Statement

Given: Polygonal domain  $P$   
with **holes**  
source and sink  $S$  and  $T$

Flow  
vector field  $\sigma: P \rightarrow \mathbb{R}^2$

$\text{div } \sigma = 0$  inside  $P$   
 $\sigma \cdot n = 0$  on  $\partial P \setminus \{S, T\}$   
 $|\sigma| \leq 1$  – capacity

$$V = \left| \int_S \sigma \cdot n \, ds \right| = \left| \int_T \sigma \cdot n \, ds \right|$$



MaxFlow

Find  $\sigma$  that maximizes  $V$

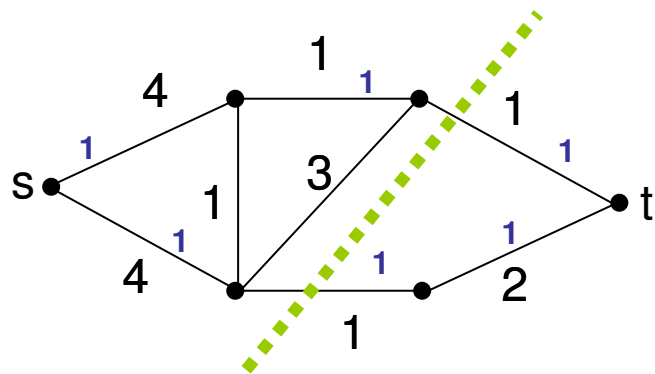
**Cut:** Partition  $P$

$S$  in one part,  $T$  in the other

**Capacity:** Length of bd between parts  
counted within  $P$  (not within holes)

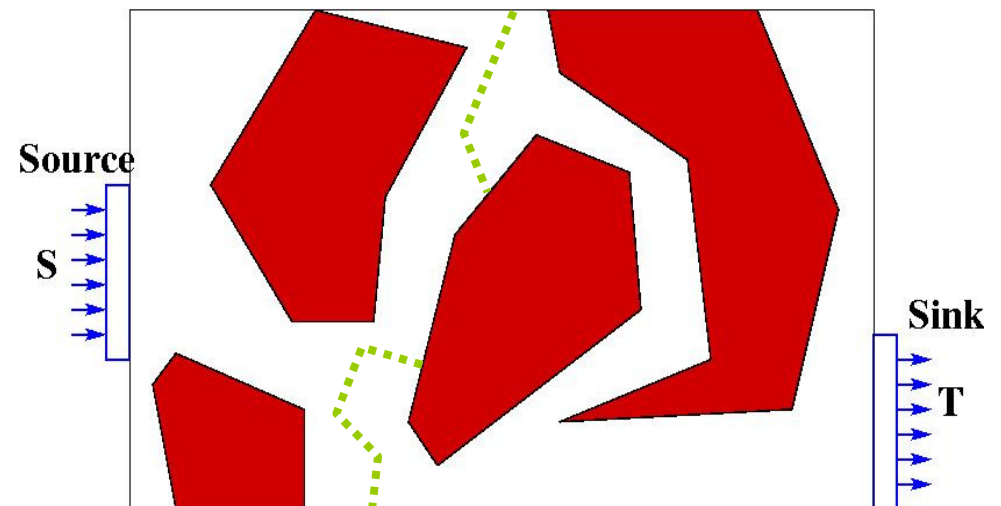
# Discrete Network

- Source and sink *nodes*
- **Cut**
  - partition nodes
  - capacity
    - edges that cross
- **Flow**
  - integers on arcs



# 2D Domain

- Source and sink *edges*
- **Cut**
  - partition domain
  - capacity
    - length of the boundary
- **Flow**
  - vector field



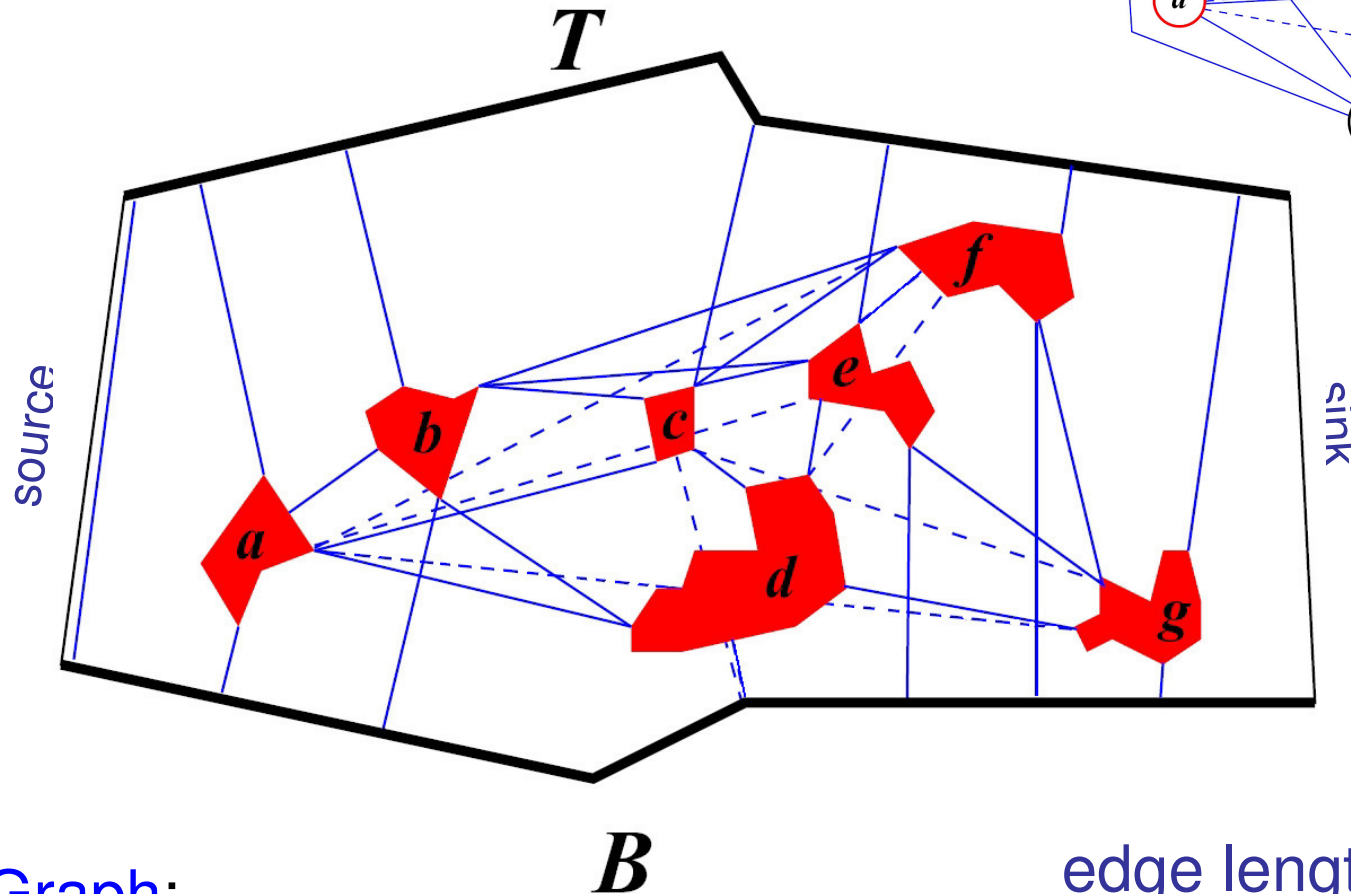
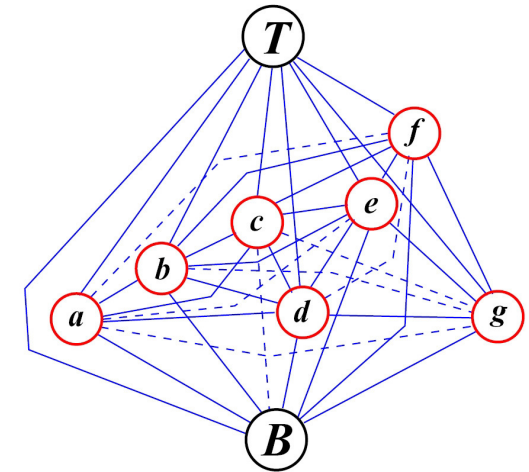


# Finding MinCut

Shortest Path in the  
“Critical Graph”

Top  $T$ ,  $\mathbf{so} \leftarrow \mathbf{si}$

Bottom  $B$ ,  $\mathbf{so} \rightarrow \mathbf{si}$



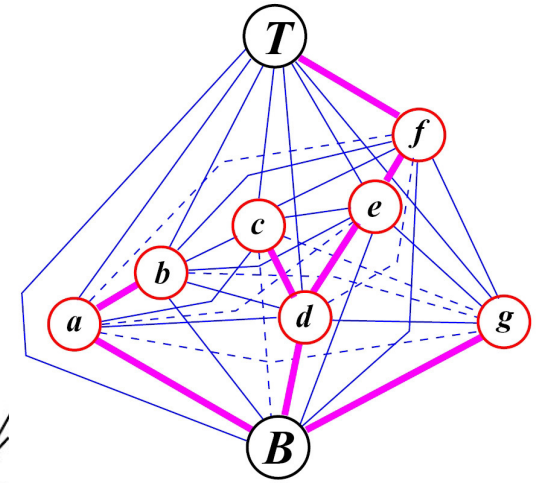
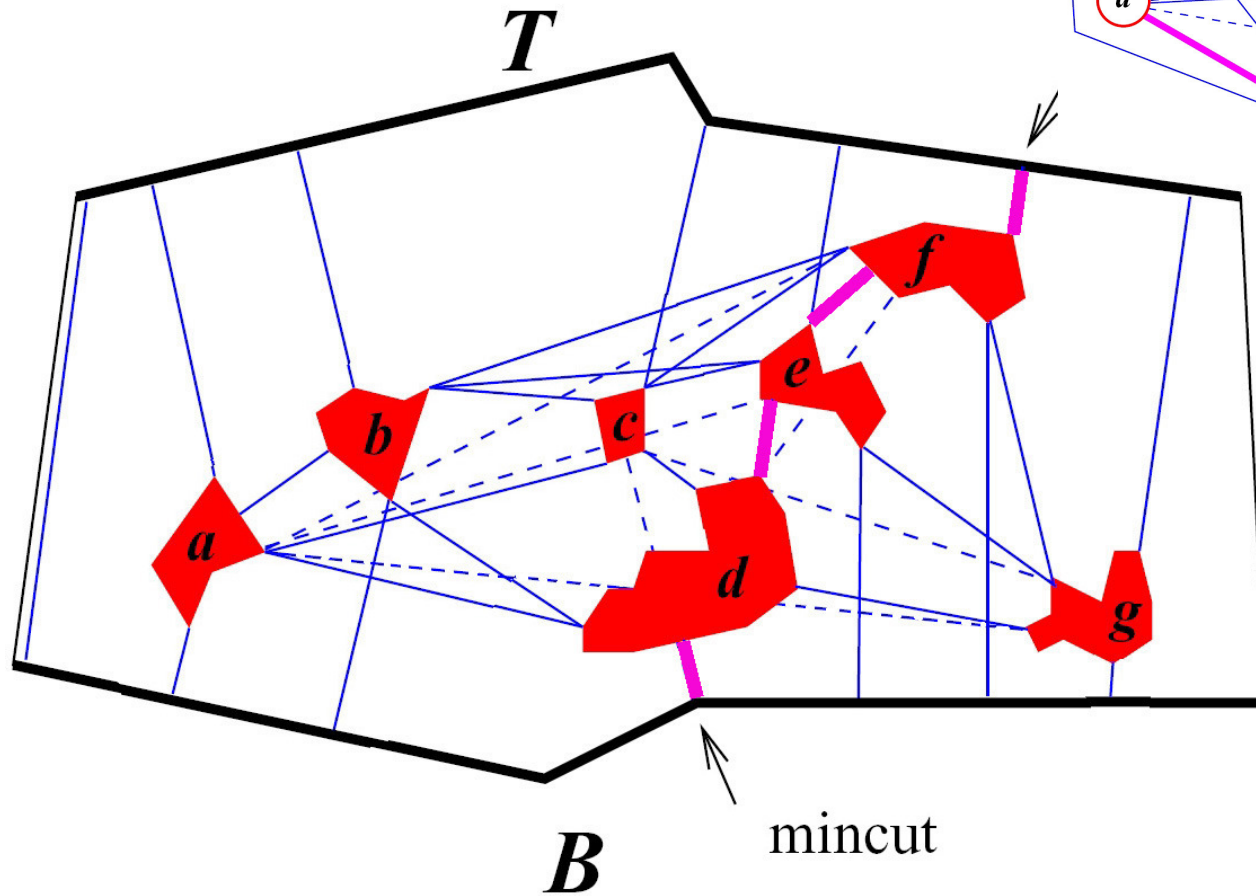
Critical Graph:

nodes for each **obstacle**, for  $T$ , for  $B$

edge length =  
Euclidean distance

MinCut =

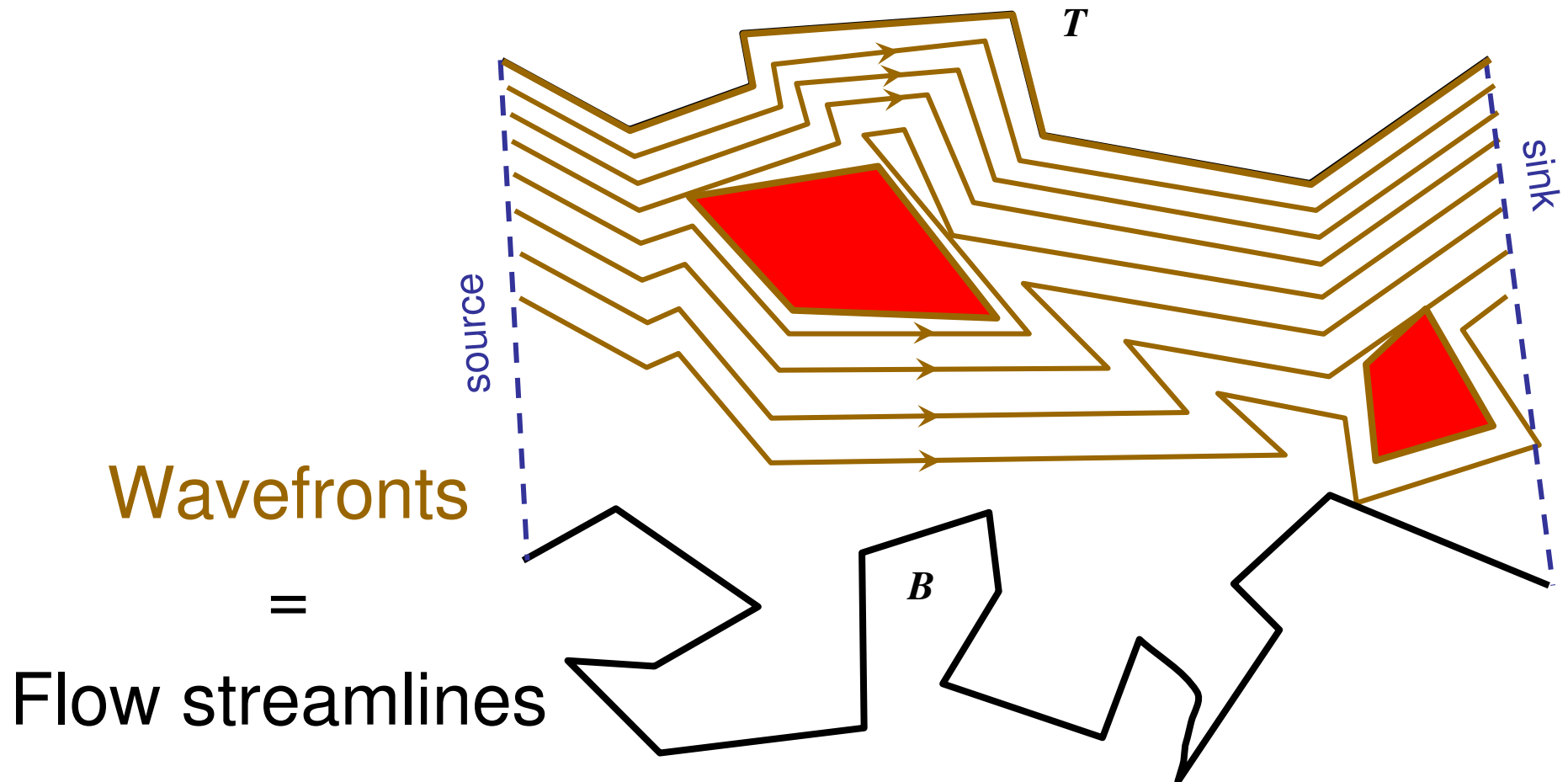
Shortest  $T$ - $B$  Path in the critical graph



# Finding MaxFlow

Continuous Uppermost Path  
Algorithm

- Wave from  $T$
- Wavefront hits a hole
  - continue propagation on hole's other side



# Continuous MaxFlow/MinCut Theorem

[Mitchell'90]

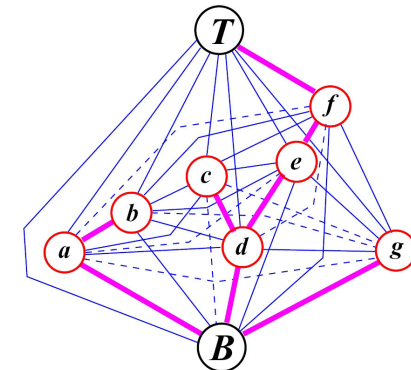
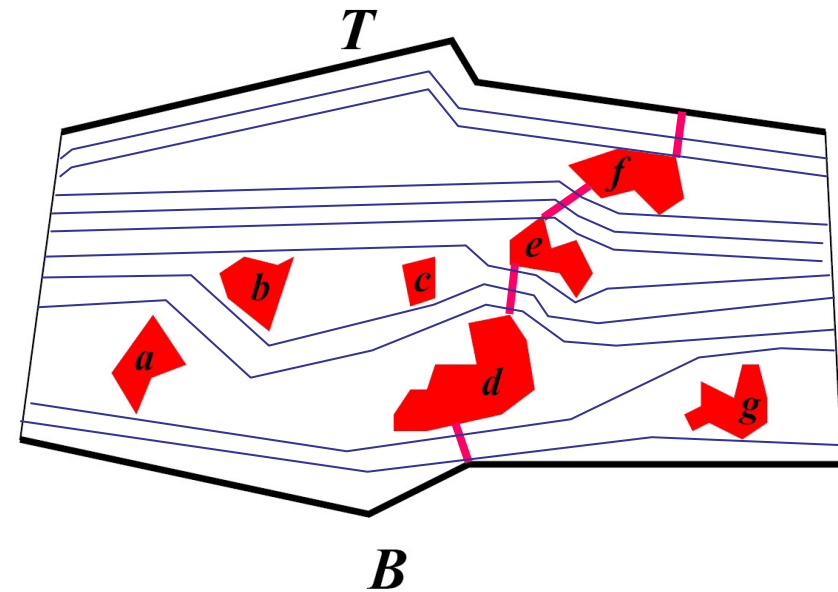
MaxFlow

=

MinCut

=

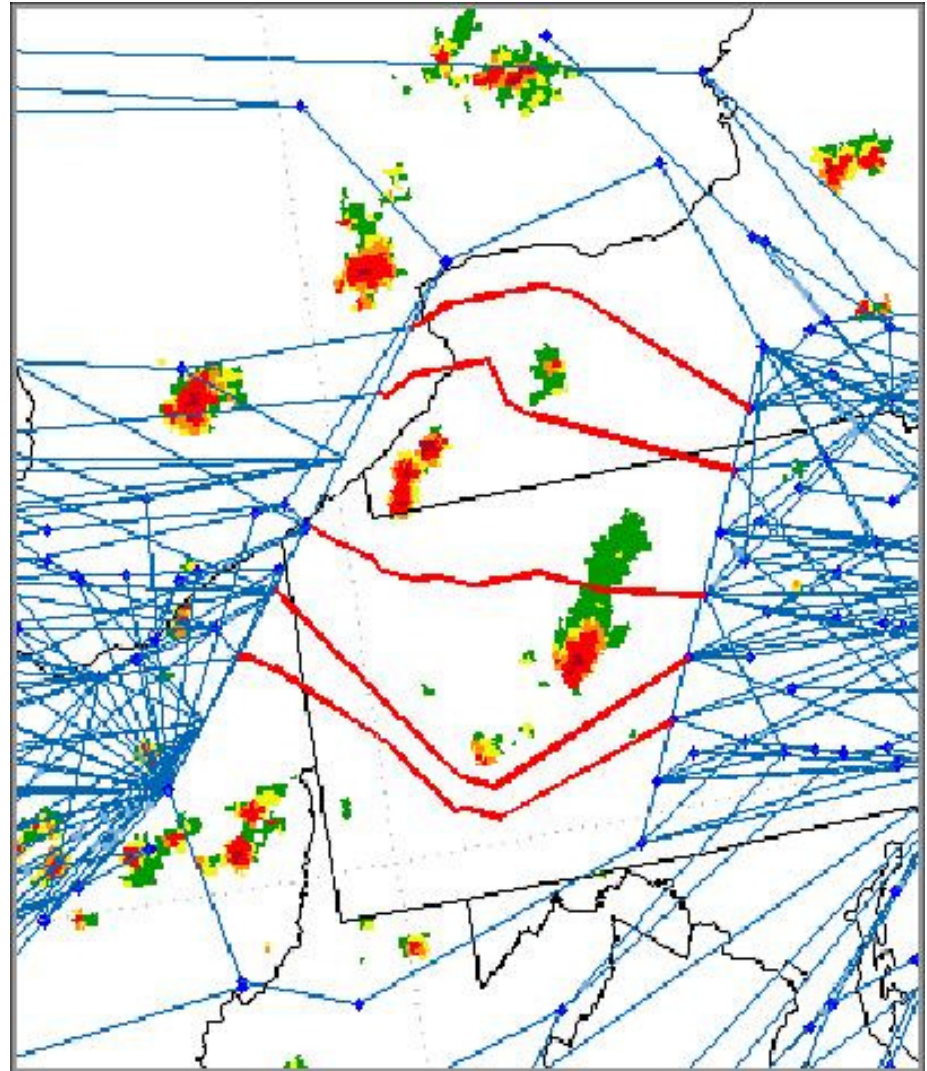
SP  $T$ - $B$  path in critical graph



Get Real!

MinCut

# Flow Constrained Area (FCA)





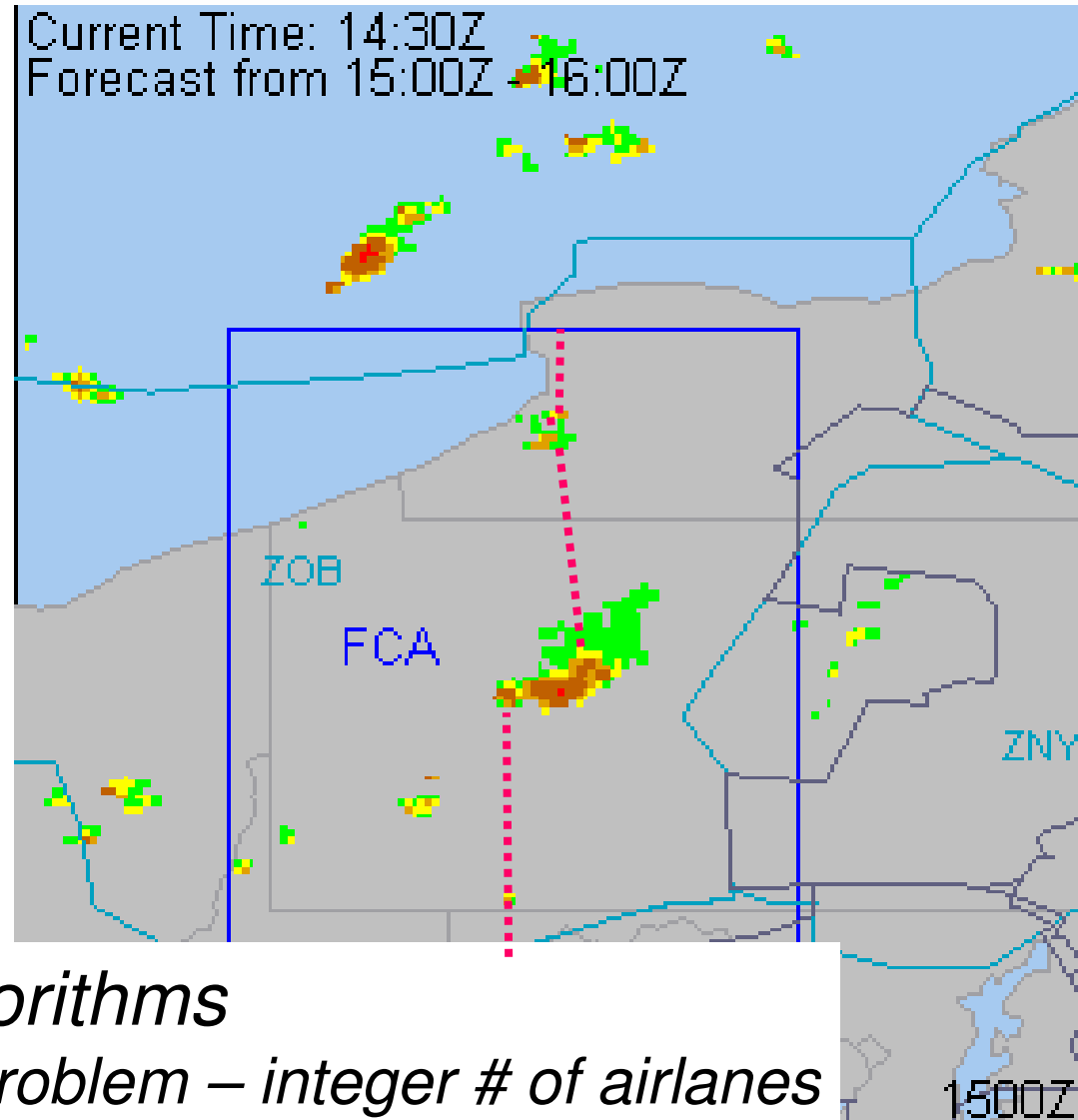
# Implementation on Real Data

MinCut

= 21.25 nmi

Airplane width =  
5 nmi

Can route  
4.25 jets



*Modify theory and algorithms*

*discrete nature of the problem – integer # of airplanes*

# Continuous Menger's Theorem

Max # of disjoint thick paths

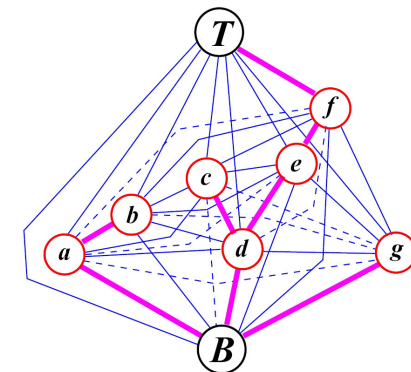
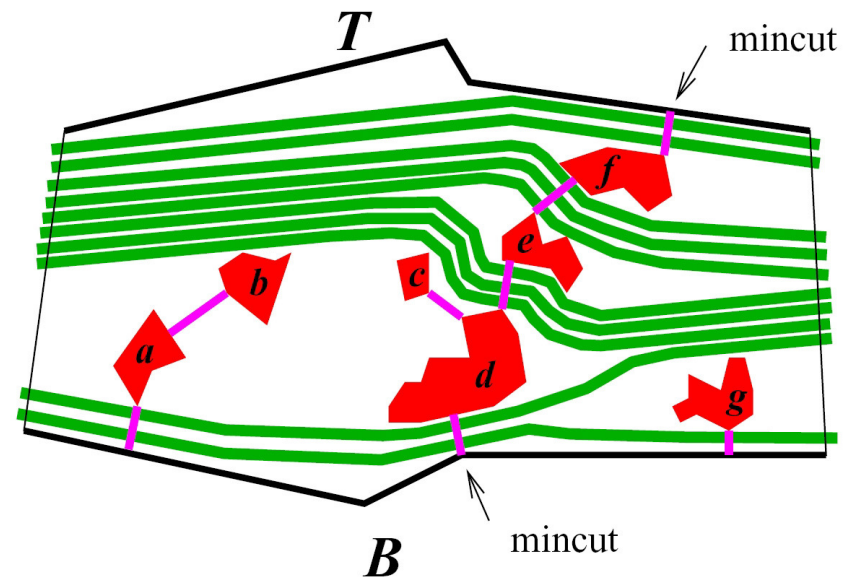
=

MinCut'

=

SP  $T$ - $B$  in *thresholded*  
critical graph

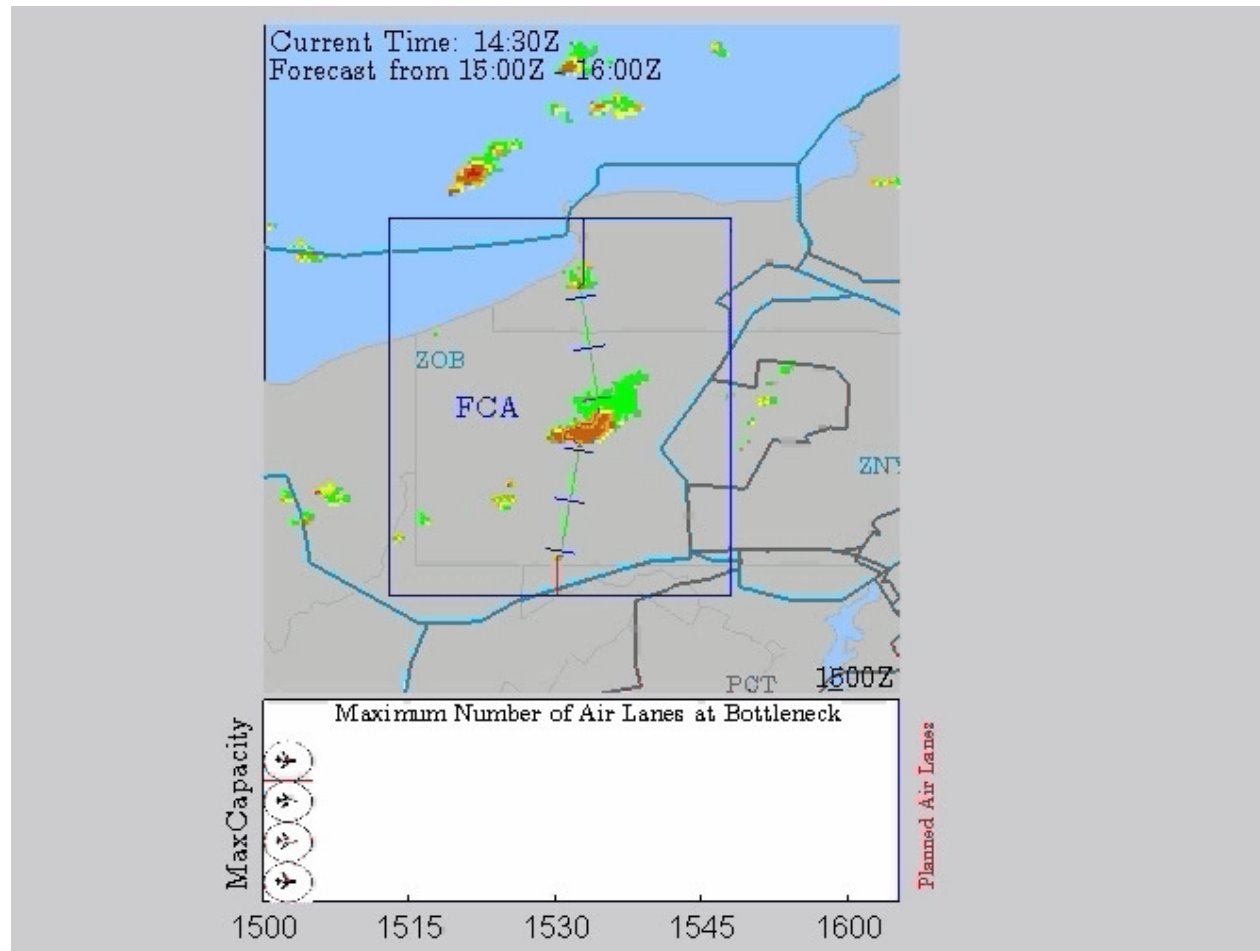
$$l_{ij} = \lfloor d_{ij} / \text{airlane width} \rfloor$$



# Movie Time!

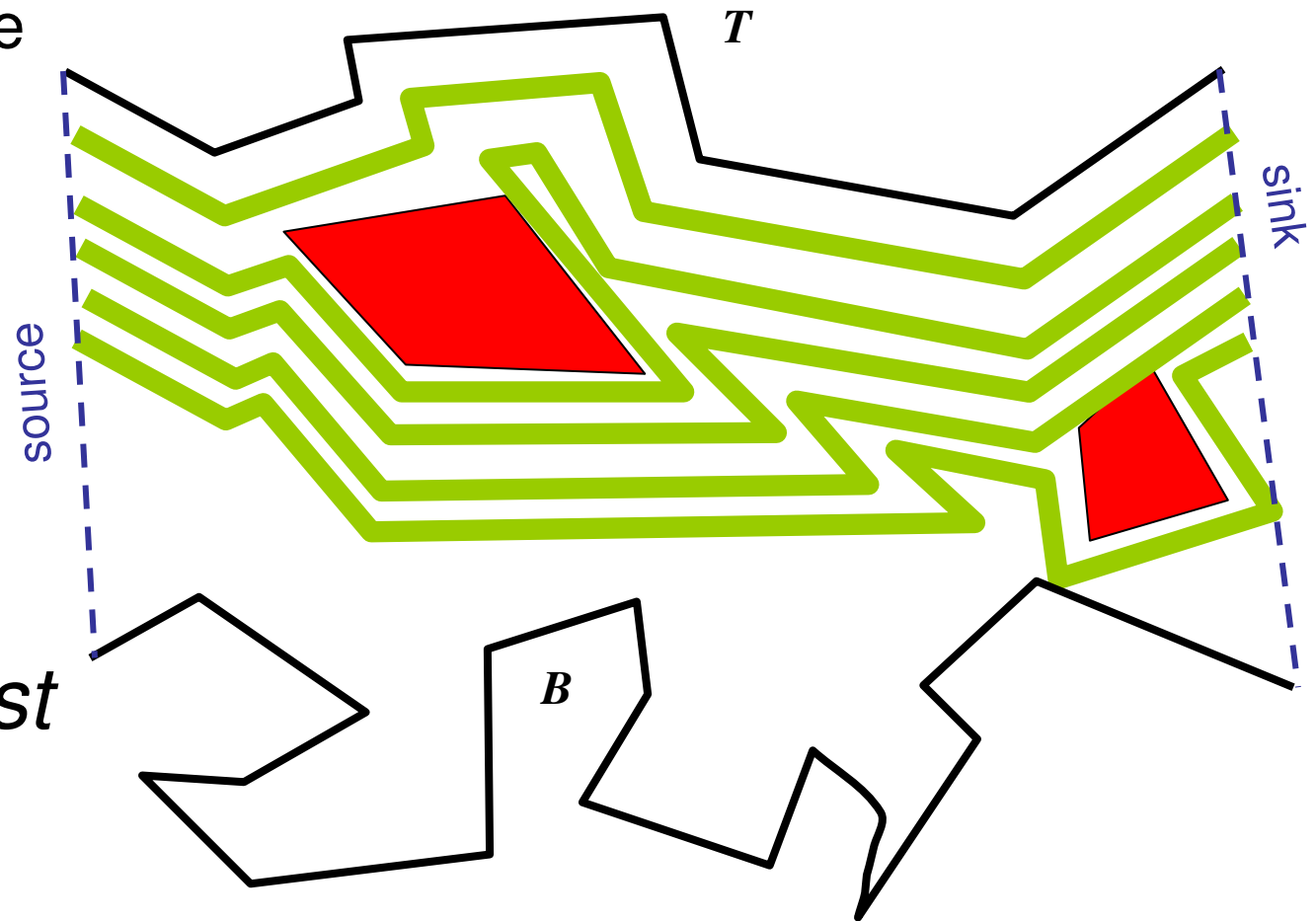
MinCut

# MinCut Over Time



# Get Real: Paths...

- “Ugly”, not flyable
- Not short



*New task:*

Find *K Shortest*  
Thick Paths

# A Thick Path

Thick path =

reference\_path

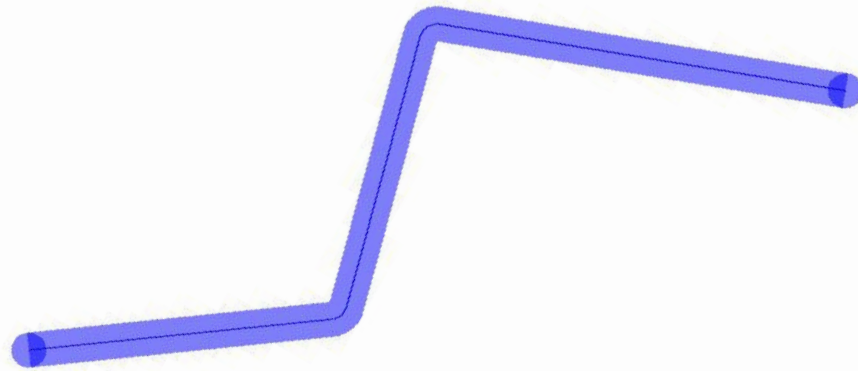


unit\_circle

Minkowski sum

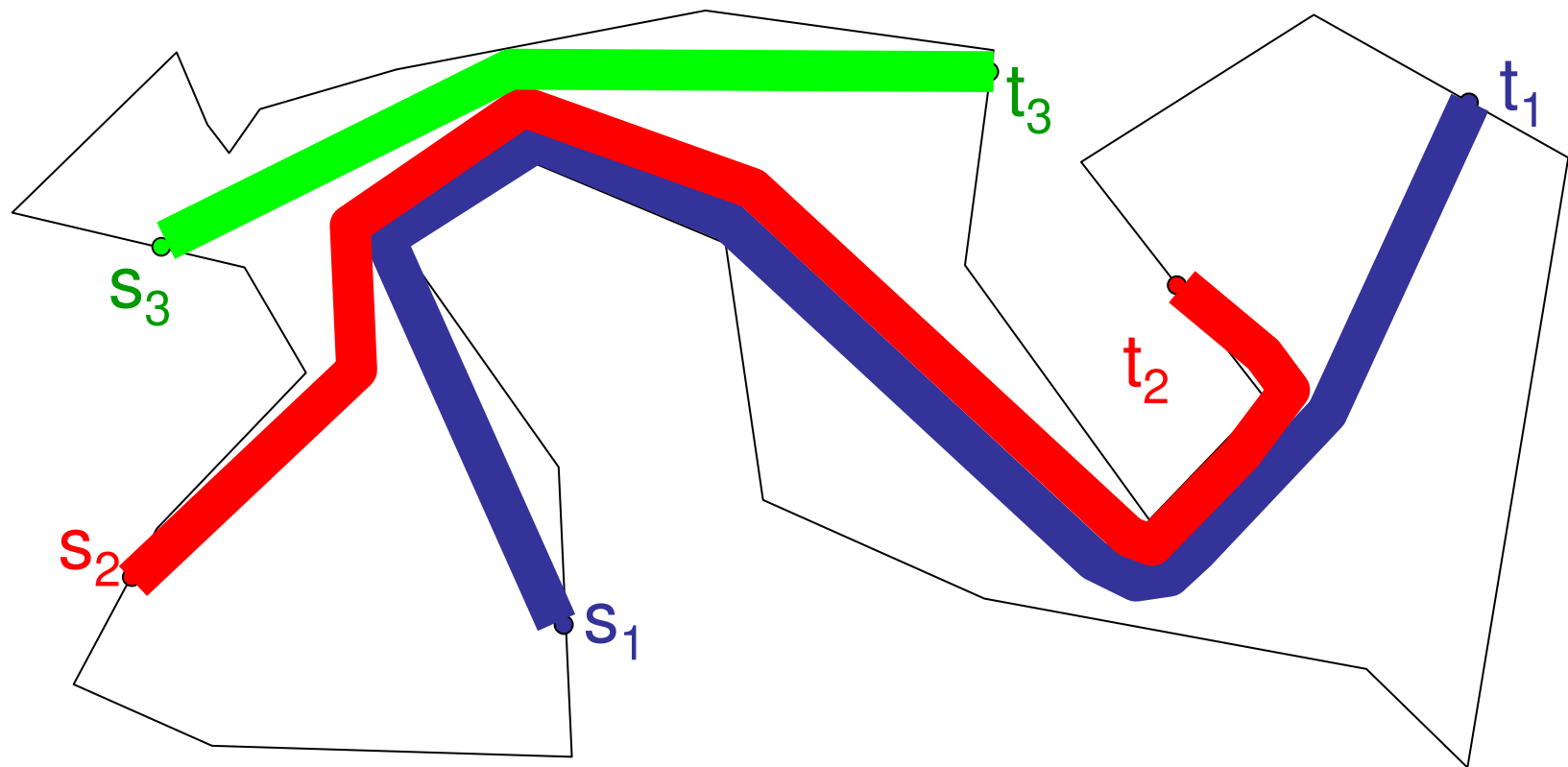
Length =

length(reference\_path)



# Problem Formulation

- Given: start-destination pairs on bd of  $P$   
 $\{ (s_1, t_1), (s_2, t_2), (s_3, t_3) \}$
- Find: shortest disjoint thickness-2  $s_k$ - $t_k$  paths

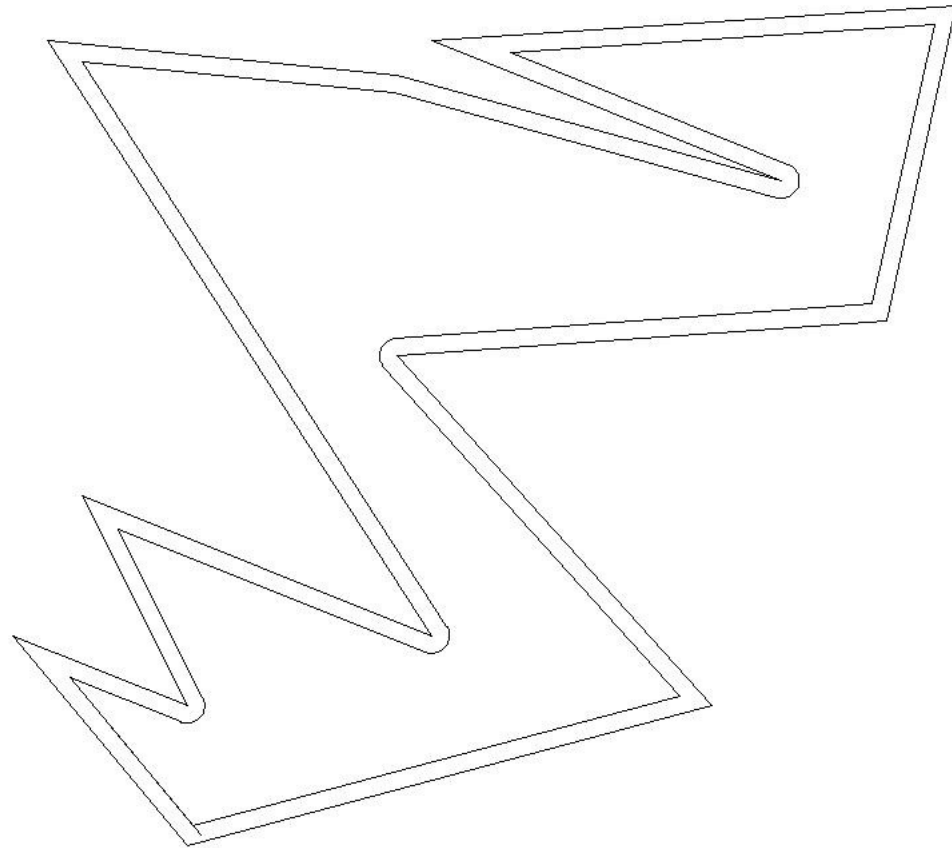
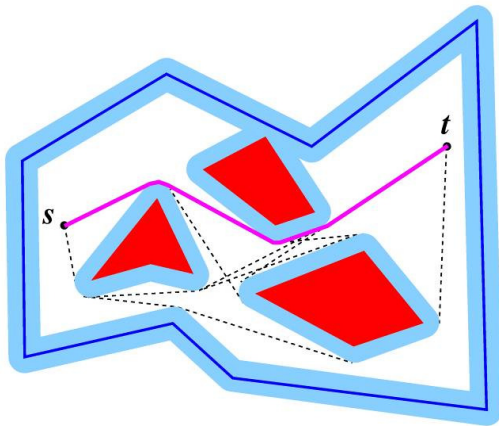


# Finding 1 Shortest Thick Path

Inflate by 1

Find shortest path

Inflate the path





# 2 Paths

Inflate by 1

Route  $s_2$ - $t_2$  path

Inflate  $P(s_1, t_1)$  by 2

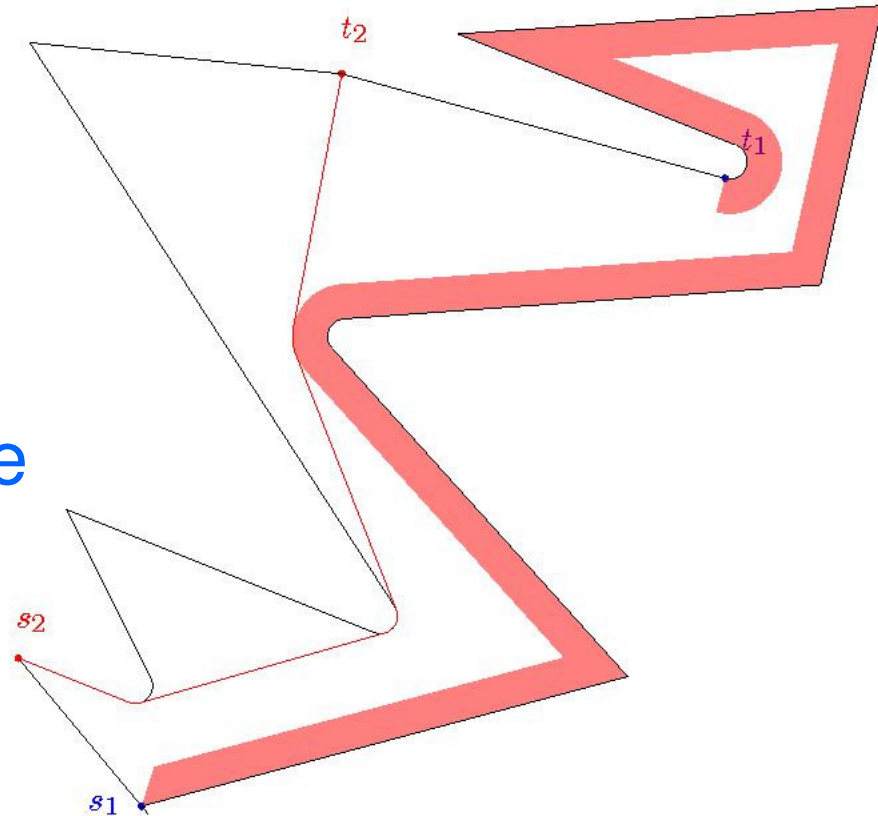
Find shortest path

Same on the other side

Inflate the paths

Non-crossing

- Each path is ASAP (as short as possible)
  - given the existence of the other
- minsum, minmax



# K Paths

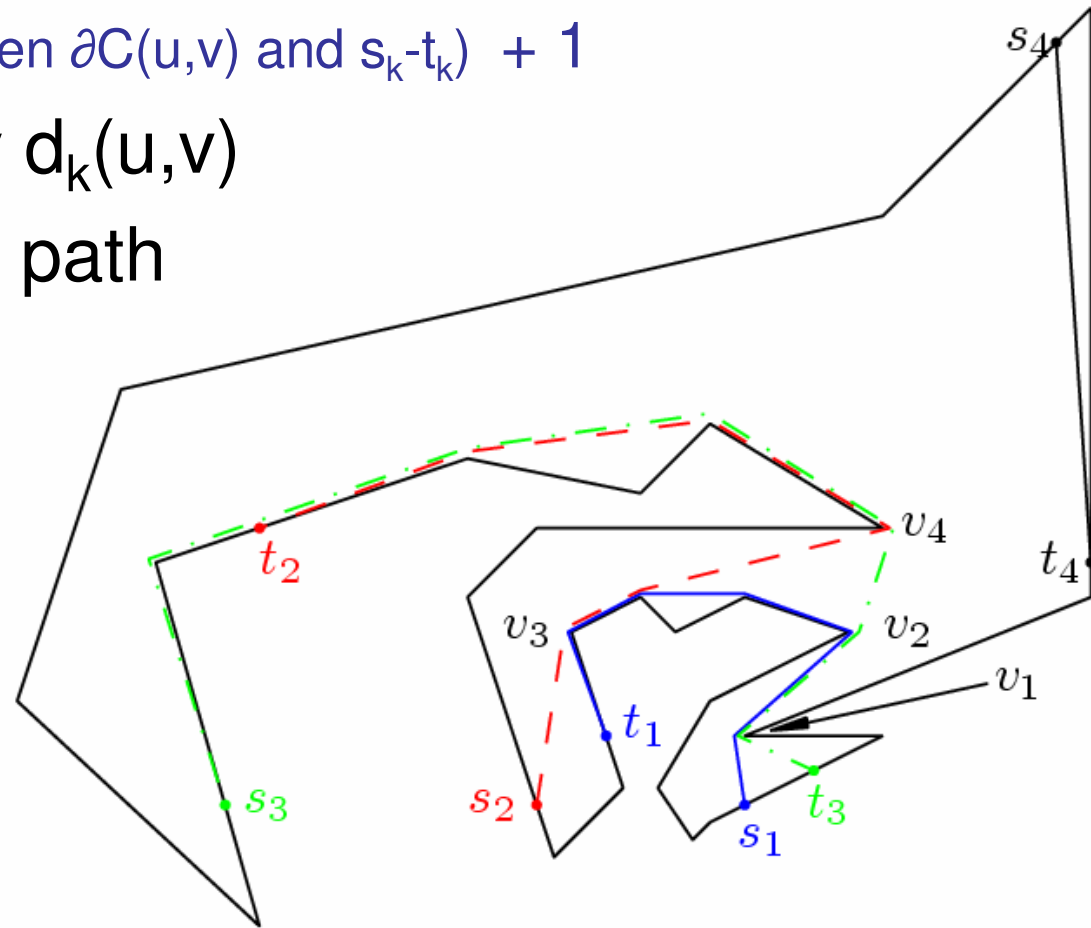
For  $k = 1 \dots K$

$$d_k(u,v) := k^{\text{th}} \text{ depth of } \partial C(u,v) \equiv \\ \equiv 2 \cdot (\# \text{ of paths between } \partial C(u,v) \text{ and } s_k - t_k) + 1$$

Inflate  $\partial P(u,v)$  by  $d_k(u,v)$

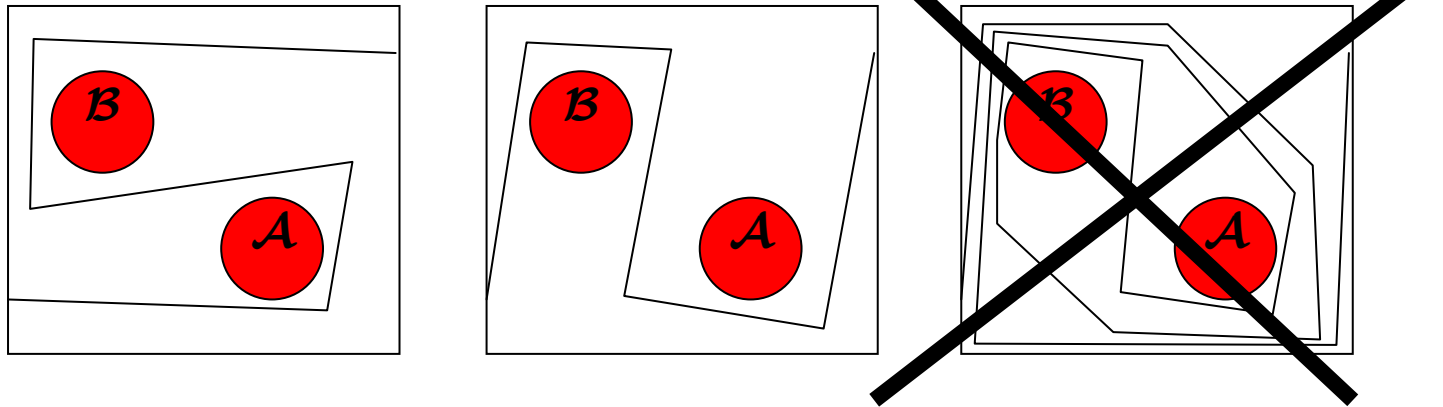
Find the shortest path

Inflate the path



# Polygons with Holes

- # of holes  $h$  is large
  - NP-hard
- $h = O(1)$ 
  - Scroll through relevant homotopy types
    - $O((K+1)^h h!)$  of them



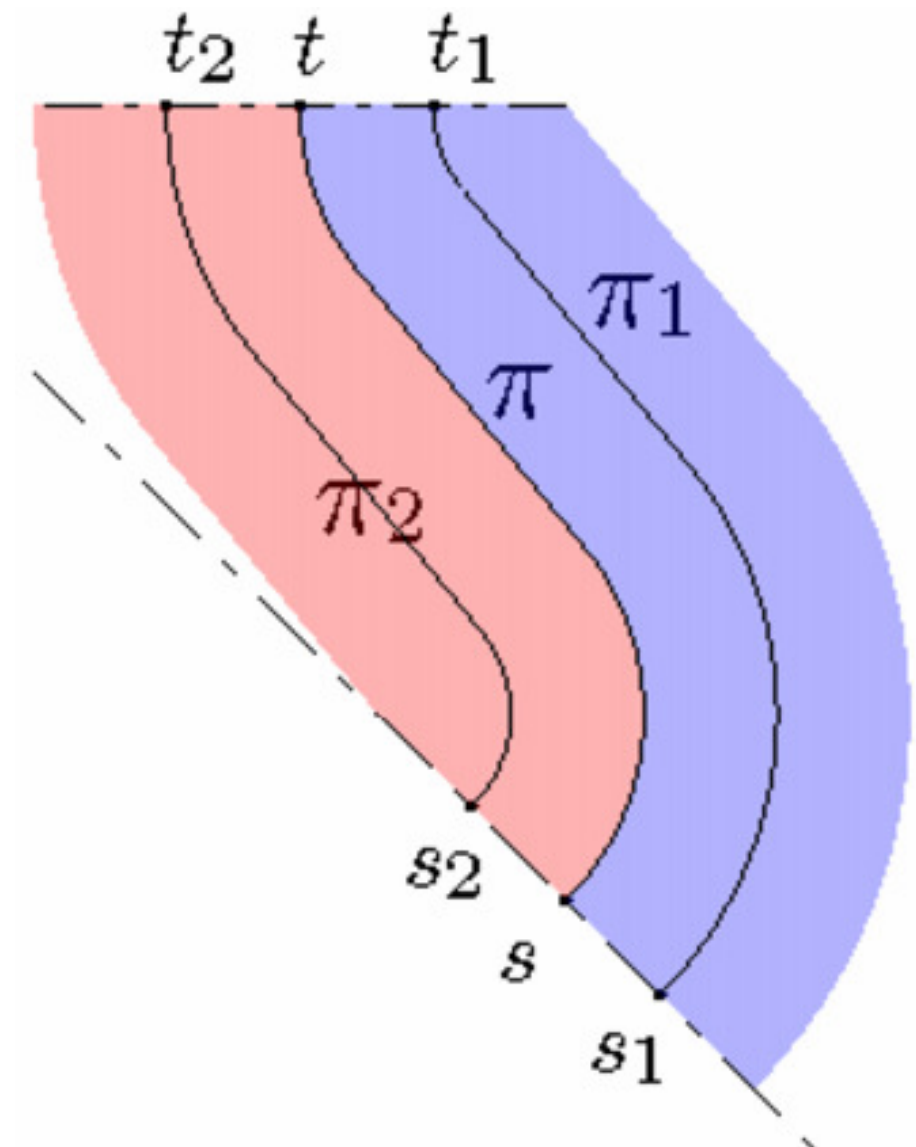
$$O((K+1)^h h! \text{ poly}(n, K))$$

fixed-parameter tractable

[Rod and Fellows '99]

# “Gluing” Shortest Thick Paths

SP  $s$ - $t$  of width 4  
=  
SP  $s_1$ - $t_1$  of width 2  
+  
SP  $s_2$ - $t_2$  of width 2



# From Paths to Flows

# Min-Cost Flow

Given: Polygonal domain  $P$   
sources  $S$  and sinks  $T$

Flow

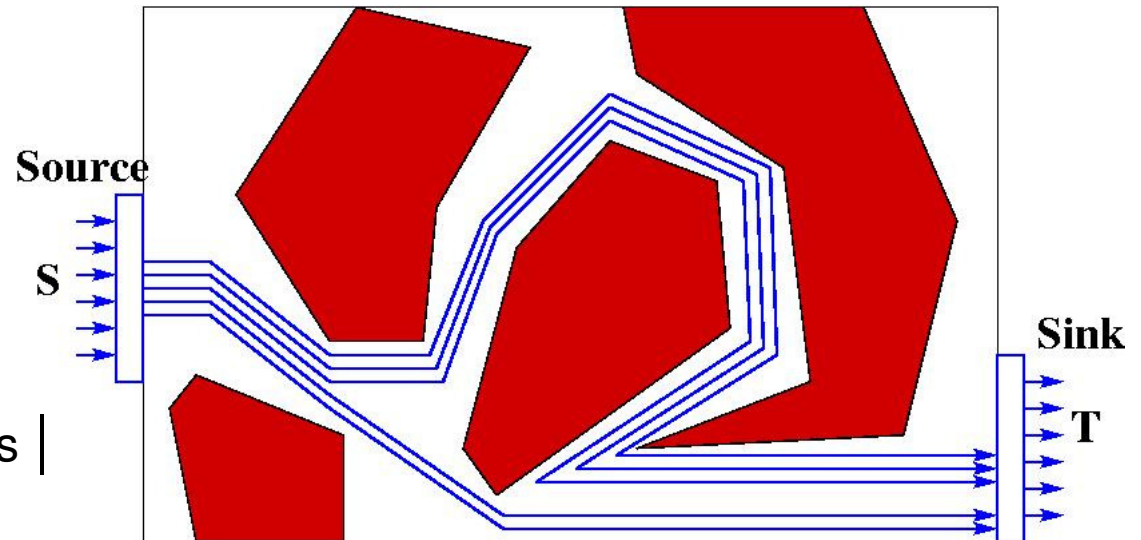
vector field  $\sigma$

$\text{div } \sigma = 0$  inside  $P$

$\sigma \cdot n = 0$  on  $\partial P \setminus \{S, T\}$

$|\sigma| \leq 1$  – capacity

$$V = \left| \int_S \sigma \cdot n \, ds \right| = \left| \int_T \sigma \cdot n \, ds \right|$$



Min-Cost Flow

Given  $V$

Find  $\sigma$  that minimizes *cost*

Cost

$|l_s|$  – length of *streamline* through  $s$  in  $S$

$$\text{cost} = \int_S |l_s| \, ds$$

# Equivalent Problems

$l_s$  – streamline of  $\sigma$  through  $s$  in  $S$

$l_s: S \rightarrow T$

$\sigma_{ab}$  – restriction of  $\sigma$

Split  $a$  into  $s_k, k=1 \dots K$

Split  $b$  into  $t_k, k=1 \dots K$

$SP(s_k, t_k)$ , width  $w/K$

Path  $\rightarrow l_s$  as  $K \rightarrow \infty$

Min-cost  $\sigma_{ab} = \int_a |l_s| ds$

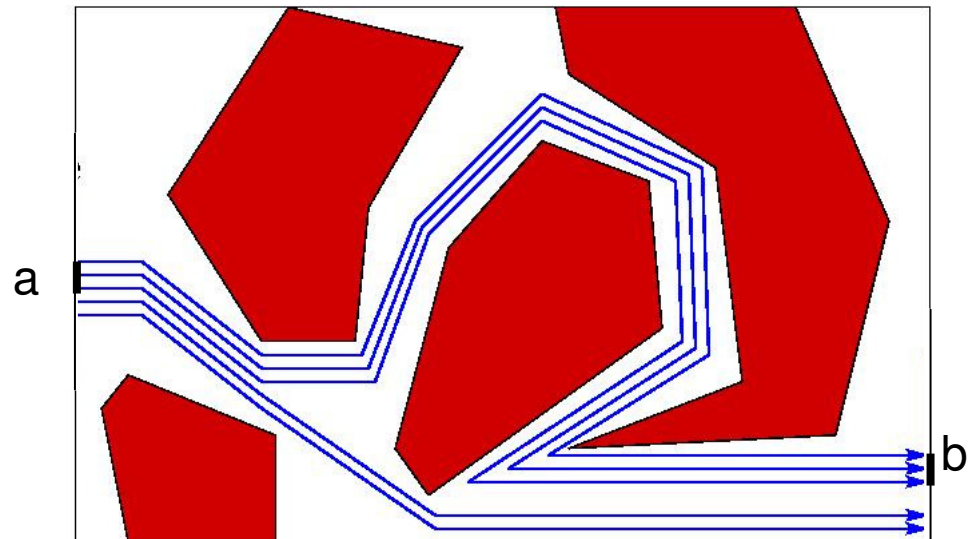
$$= \sum_k SP(s_k, t_k)$$

Contiguous subsets of  $S$   
mapped into

Contiguous subsets of  $T$

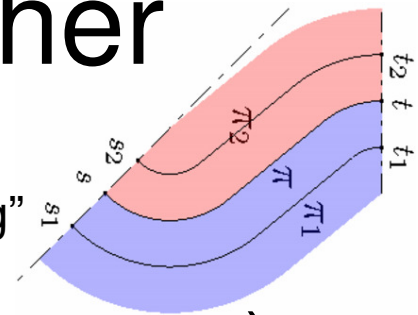
$$l_s(a) = b,$$

$$|a| = |b| = w$$



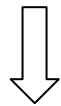
# Gluing Things Together

Min-cost  $\sigma_{ab} = \sum_k SP(s_k, t_k) =$  by "Gluing"  
 $= 1$  Shortest Thick Path (from midpoint of  $a$  to midpoint of  $b$ )

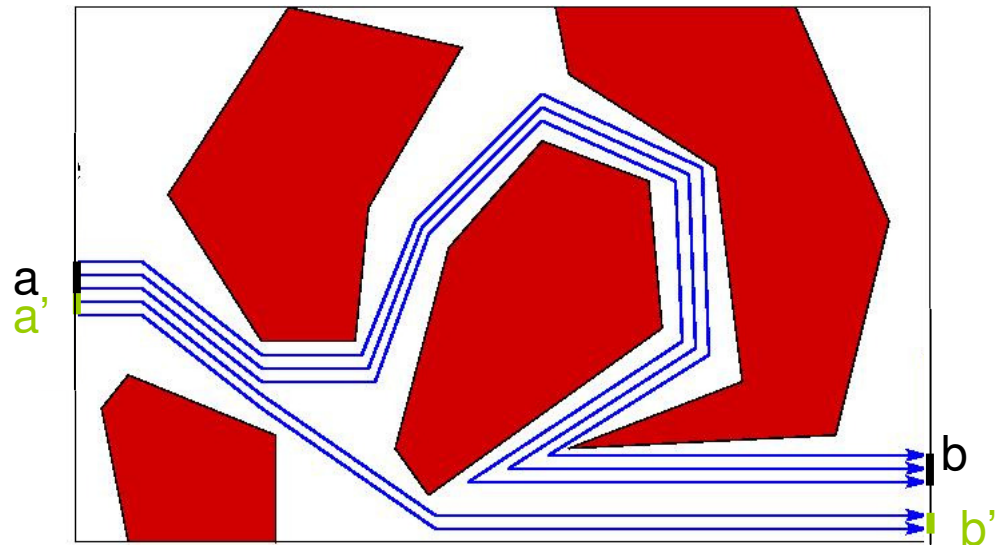


$$\sigma = \sigma_{ab} + \sigma_{a'b'} + \sigma_{\dots}$$

Intervals of continuity of  $l_s: S \rightarrow T$  and its inverse



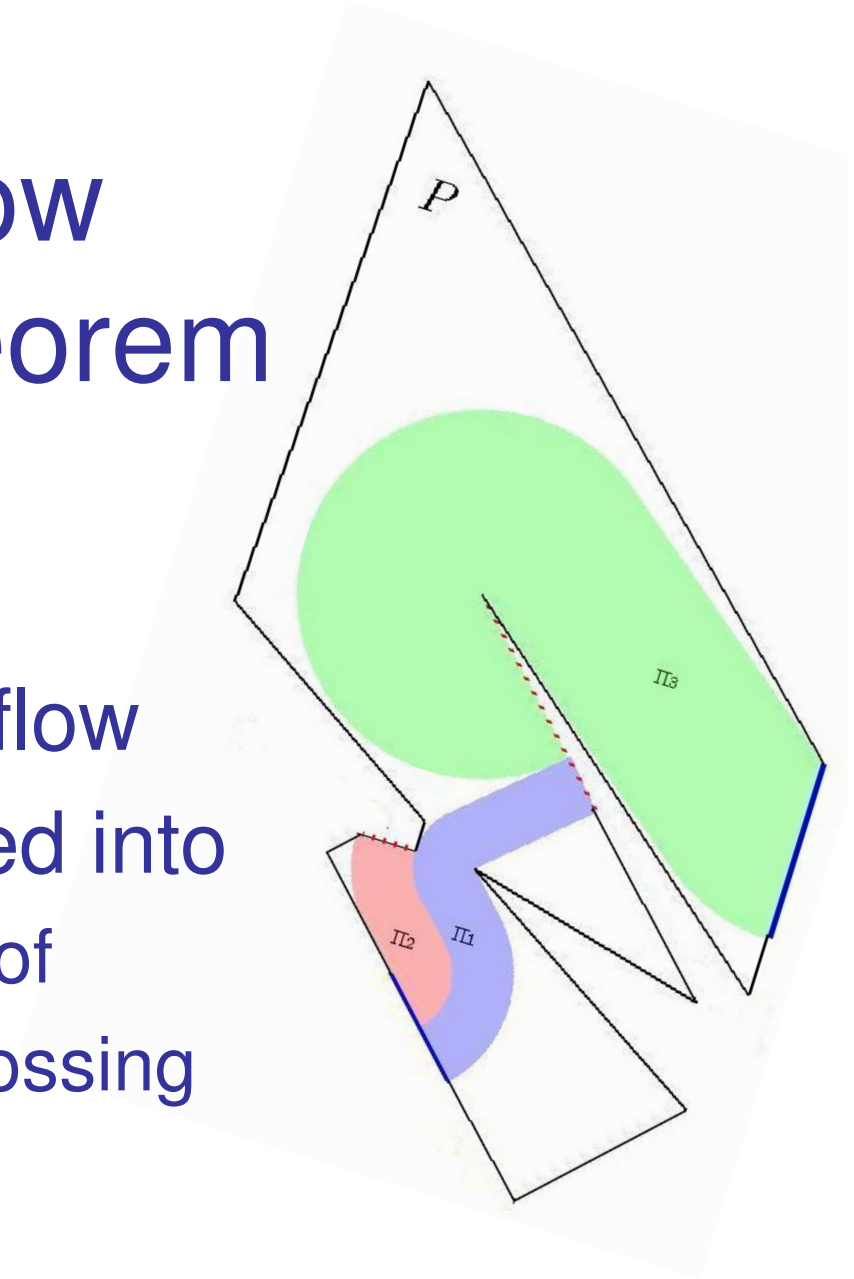
Min-cost Flow =  
Thick Non-Crossing  
Paths





# The Continuous Flow Decomposition Theorem

The support of  
a minimum-cost flow  
may be decomposed into  
a linear number of  
shortest thick non-crossing  
paths



# Get Real!

## Thick Paths

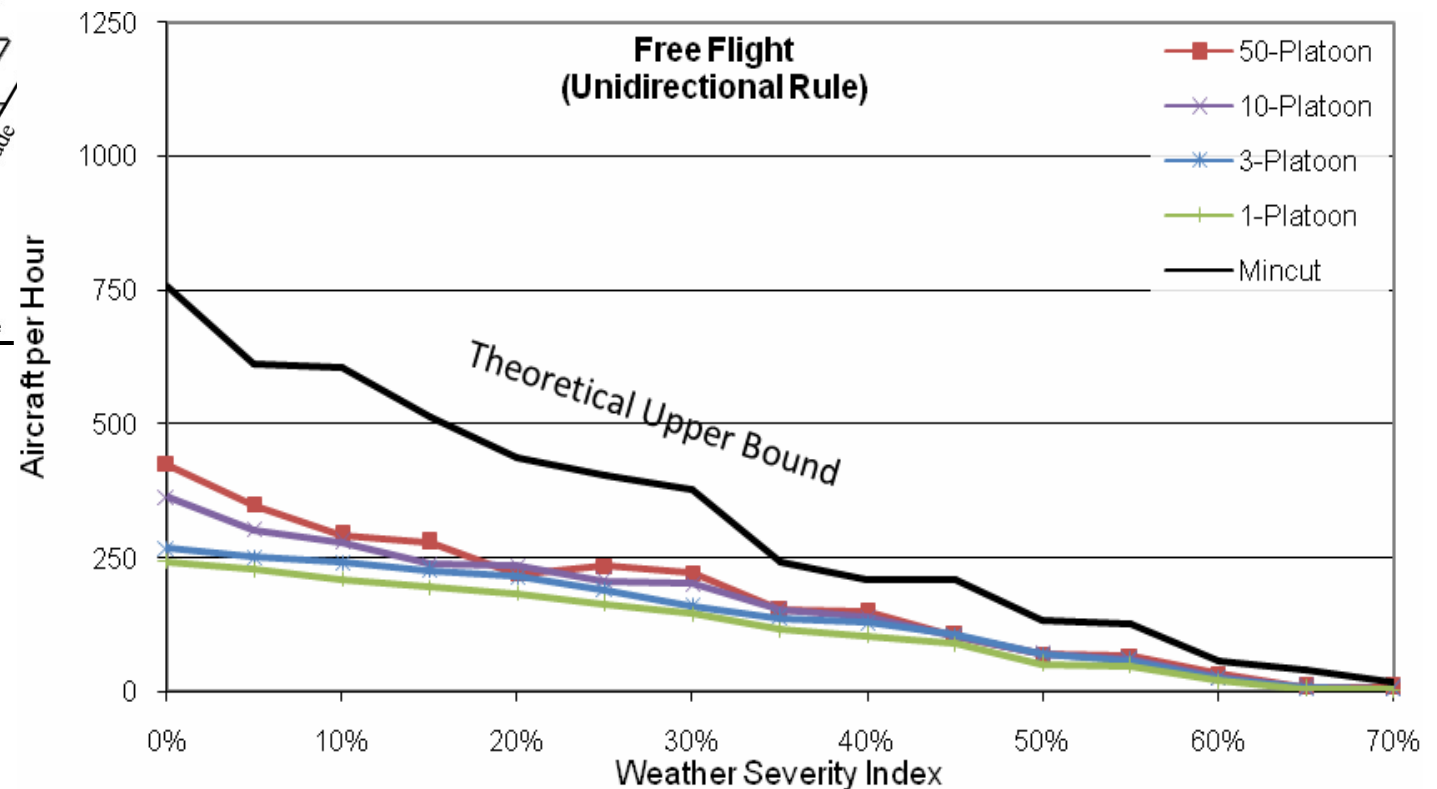
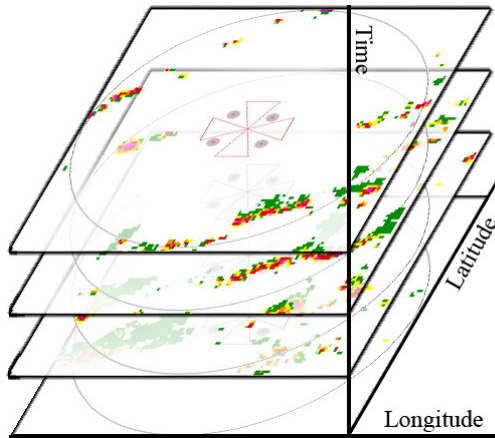
### Flow-Based Route Planner

[Prete '07,  
Krozel, Mitchell, Penny, P, and Prete '04-07]

# Flow-Based Route Planner

- Heuristic
  - Uniform grid

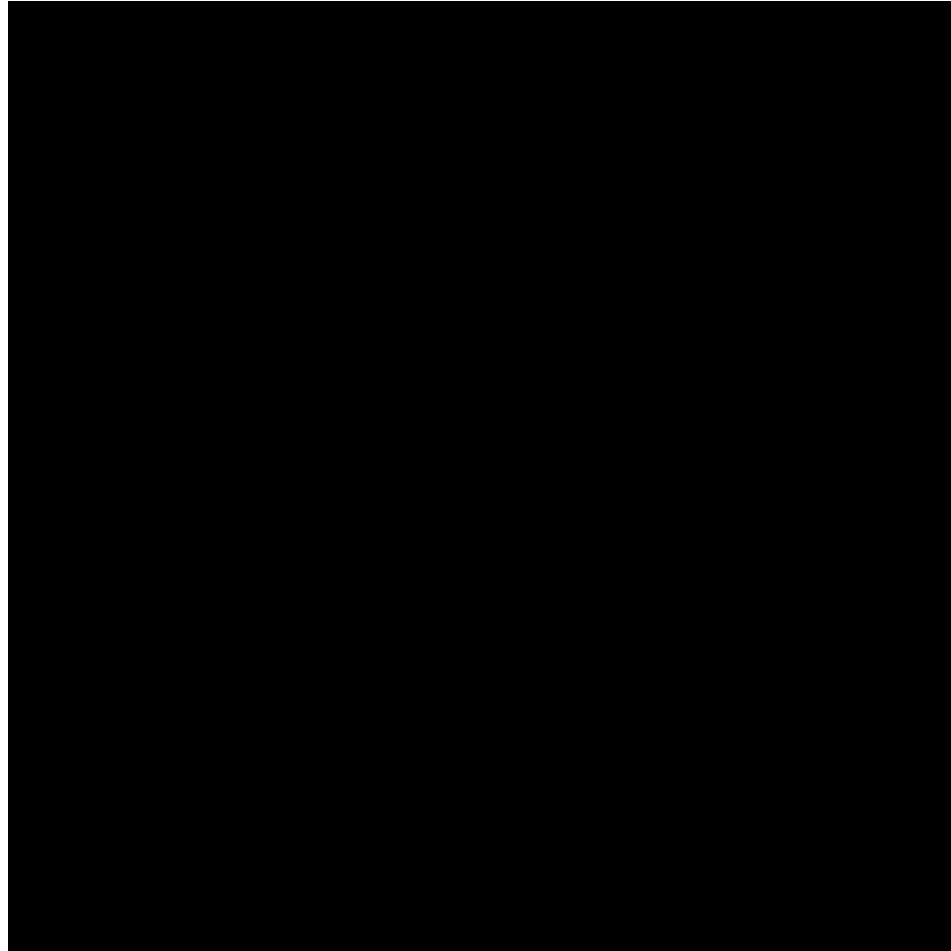
- While possible
  - find a path
  - call it an obstacle



# Movie Time!

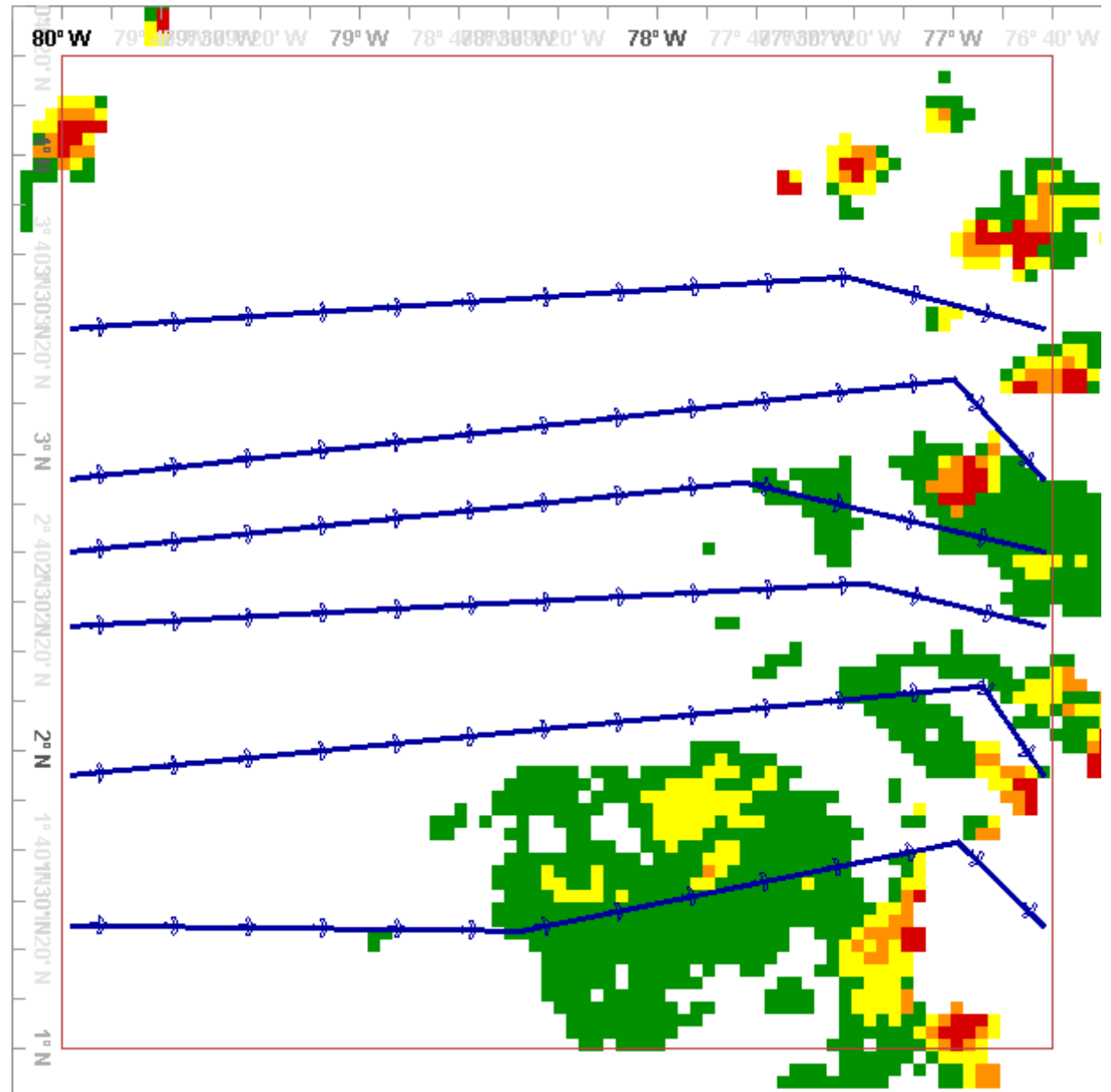
## Thick Paths

# Flow-Based Route Planner



# (At Least) Two Shortcomings

- Obstacles are static
- The routes are non-crossing



# Dynamic Version

- Given
  - *moving* obstacles
- Find
  - trajectories for a maximum number of aircraft

# Movie Time!

Thick Paths in Dynamic Environment

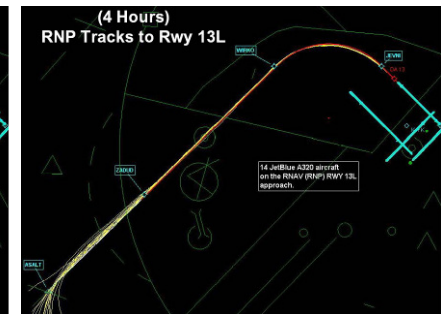
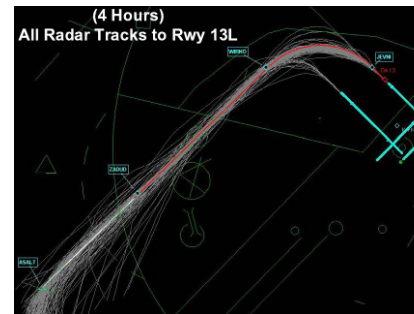
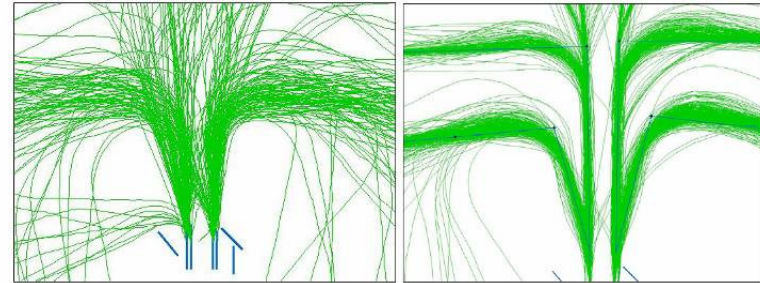


# Dynamic Planning

If there exist **K** paths for  
**unit** discs  
moving with speed  $\leq 1$

we find, for any  $\Delta t < 1/2$

$\geq K$  paths for  
discs of **radius**  $(1/4 - 3/8 \cdot \Delta t)^2$   
moving with speed  $\leq 7 / \Delta t$



Improve navigation and speed – get opt!

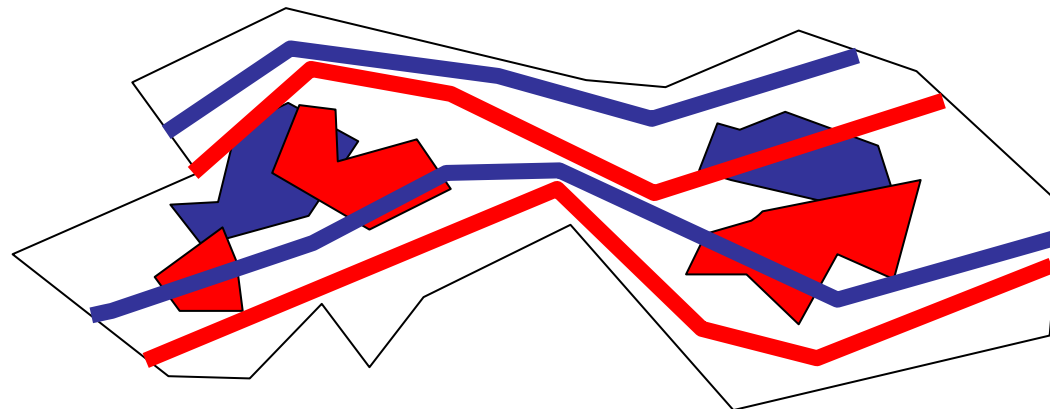
Path thickness = navigation performance

# Summary

	Networks	2D
Dijkstra's Alg [Mitchell'86]		
MaxFlow/MinCut [Strang'83]		
Uppermost Path Alg [Mitchell'90]		
Menger's Theorem [Arkin, Mitchell, and P '08]		
Flow Decomposition [Mitchell and P '07]		

# Open: Theory

- SP on surface of arbitrary polyhedron
- 1 thick path,  $o(n^2)$  alg
- 1 thick wire, poly-time alg
  
- Planning in face of uncertainty
- Geometric multicommodity flows



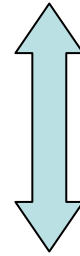
# Open: Practice

- Implement existing algs
- Design new

***Produce movies!***



Pilots



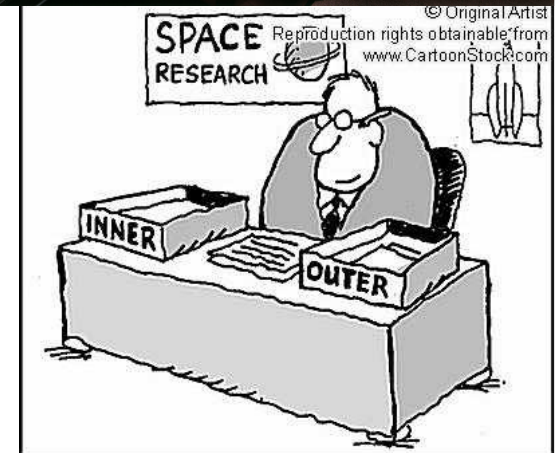
ATC



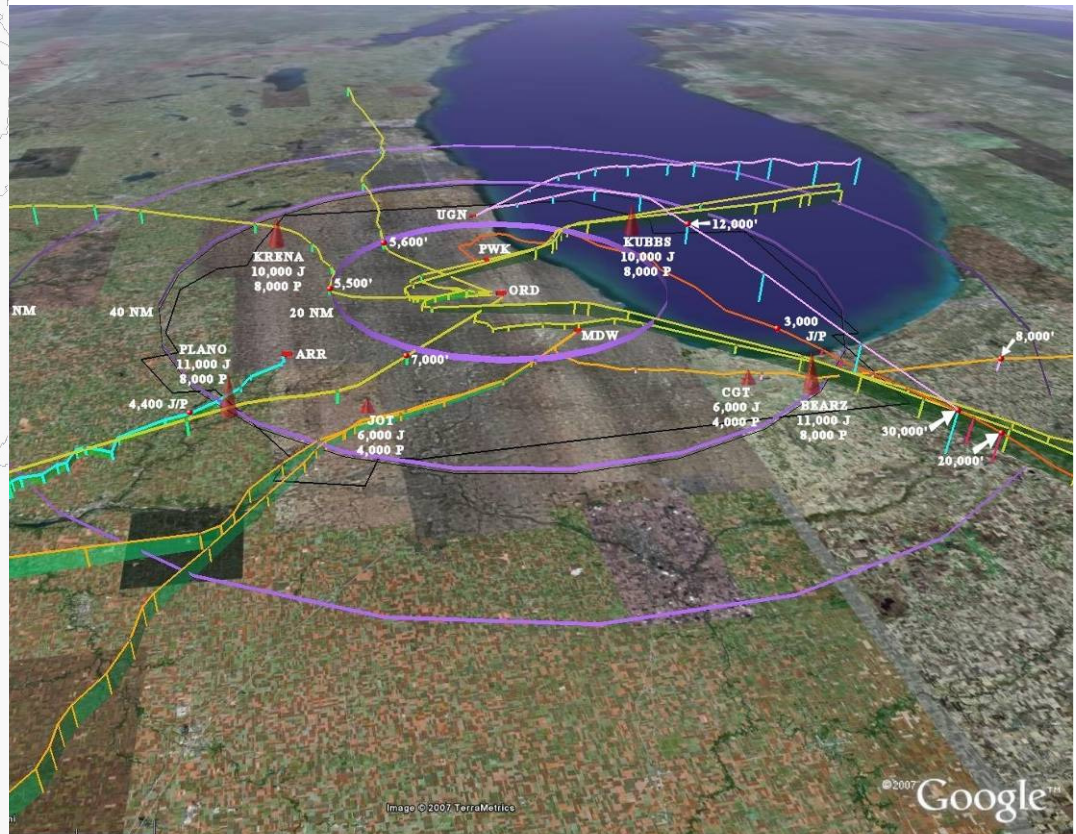
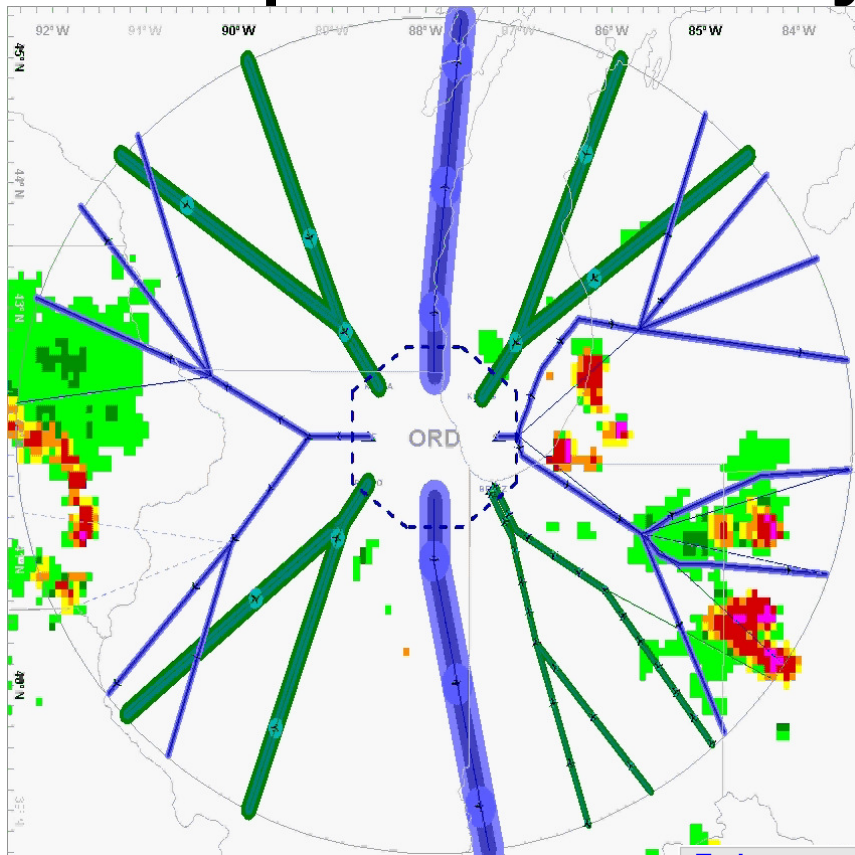
ATM



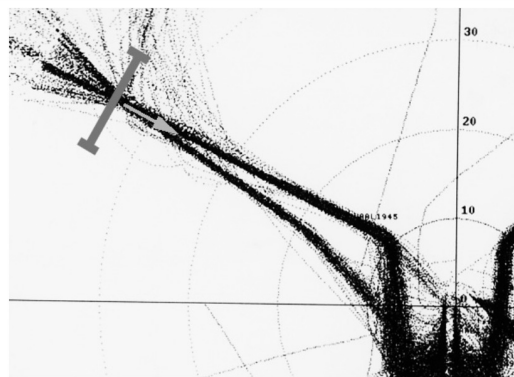
Researchers



# Open: Theory and Practice



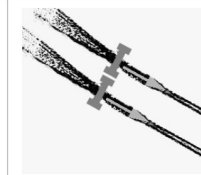
Today



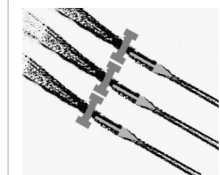
Future



**Single Fix;**  
Variance of  
incoming flow  
reduced by FD  
precision  
guidance



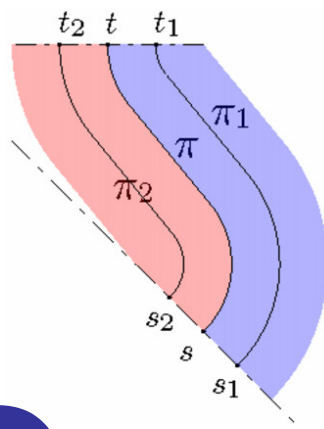
**Double Fix;**  
Two non-  
intersecting flows  
arrive at the  
metering fix  
location; requires  
precision  
guidance



**Triple Fix;**  
Three non-  
intersecting flows  
arrive at the  
metering fix  
location; requires  
precision  
guidance

Arrival/departure trees  
Constrained paths  
(turns, wiggle rooms)

# Thank



# you!

