

# Shortest Paths with Arbitrary Clearance from Navigation Meshes

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# Motivation

- Path planning is important for navigation
  - For finding paths for autonomous agents
  - For determining if locations are reachable
  - For obtaining distances to possible targets
  - etc
- Useful paths are not that easy to compute
  - Guaranteed clearance is often needed
  - Paths have to be short and smooth
  - Efficiently computed
  - etc

# Euclidean Shortest Paths

- Globally shortest paths are difficult to find
  - Is a global problem in 2D
  - Ex: the shortest path in the medial axis graph of a given environment may not be continuously deformable to the shortest path in the environment
    - Medial axis can only give “locally shortest paths”
- The problem can be solved in  $O(n \log n)$ 
  - $n$  = num. input segments
  - Continuous Dijkstra approach solves it
  - Difficult to implement and to consider clearance

# Considering Clearance

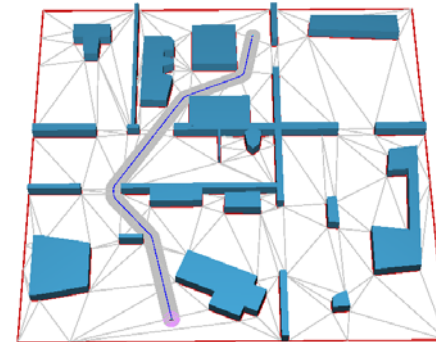
- Preprocessing for a specific clearance value
  - Lozano-Pérez and Wesley 1979
  - Chew 1985
    - First dilates the environment, then uses visibility graph of tangents
    - Precomputation:  $O(n^2 \log n)$ , produces graph with  $O(n^2)$  elements
    - Query:  $O(n^2 \log n)$
- Clearance-independent preprocessing possible
  - Wein, van den Berg and Halperin, “the visibility–Voronoi complex and its applications”, 2007
    - Preprocessing:  $O(n^2 \log n)$
    - Query time:  $O(n \log n + m) = O(n^2)$
    - *Probably the best practical method for global optimality*

## Related Work in Animation

- Multi Agents
  - Elastic roadmaps
    - Gayle, Sud, Andersen, Guy, Lin and Manocha, 2009
  - Multi agent navigation graphs
    - Sud, Andersen, Curtis, Lin and Manocha, 2008
  - Velocity Obstacles
    - van den Berg, Lin and Manocha, 2008
- Methods based on the medial axis or Voronoi diagrams
  - Hardware acceleration also used
    - Hoff, Culver, Keyser, Lin and Manocha 2000
  - Corridor Maps are very related
    - Geraerts and Overmars, 2007
    - Geraerts, 2010
- Methods based on randomized planners

## Proposed Work

- New navigation mesh that enables the efficient computation of locally shortest paths with clearance



## Navigation Meshes

- Navigation meshes are very popular
  - Google results: “navigation mesh” 14.7M, “visibility graph” 5.1M
    - Update of Jul 12: now Google shows: 4.1M and 4.2M
  - Meshes are directly available from environment geometry
  - Meshes are known structures
- However
  - Navigation meshes are not well defined, many techniques used
  - Difficult to obtain paths with clearance
  - Difficult to guarantee optimality aspects
- Reality
  - Globally shortest paths (with or without clearance) cannot be easily extracted from navigation meshes

## Navigation Meshes

- Only few previous work based on triangulated meshes
  - Kallmann et al 2003
  - Lamarche and Donikian 2004
  - Demyen and Buro 2006
- However
  - Optimality not (or not well) addressed
  - Clearance not (or not correctly) addressed

# Method Overview

- Summary of algorithms
  - 1. Computation of the Navigation Mesh
  - 2. Channel Search
  - 3. Locally Shortest Path Extraction from Channel
  - 4. Extended Search for Globally Optimal Path

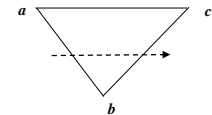
# 1. Mesh Computation

# Which Navigation Mesh to Use?

- Triangulations
  - Easier to work with triangle primitives
  - Triangulation of  $n$  segments usually have  $O(n)$  triangles
- Starting point: CDTs
  - Obstacles segments become constraints
  - Can be computed in  $O(n \log n)$

# Triangle Clearance

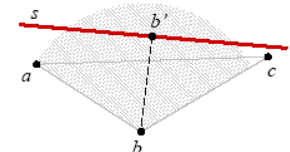
- Definition: Triangle Traversal  $\tau_{abc}$



- Definition: Traversal clearance

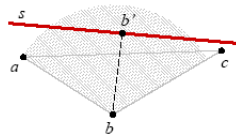
$cl(a, b, c) = \text{Distance}(b, \text{closest vertex or constraint})$

$$cl(a, b, c) \leq \min\{\text{dist}(b, a), \text{dist}(b, c)\}$$



# Clearances are Precomputed

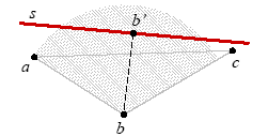
- For every traversal  $abc$  :
  - Compute its clearance and store it in the triangulation
  - Two values stored per edge



- Path with clearance  $r$  may pass traversal  $abc$  if:  
 $r \leq cl(a,b,c)$

# Clearances are Precomputed

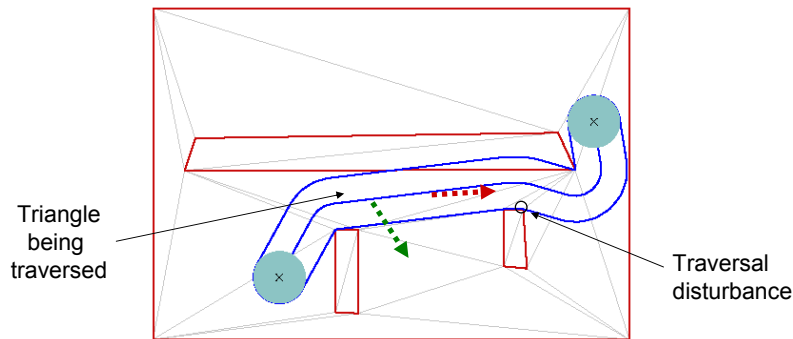
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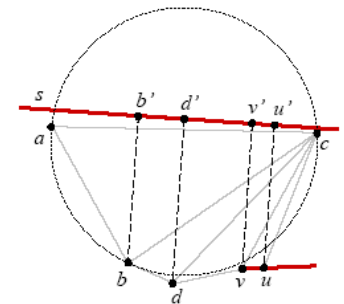
# CDTs Are Not Enough

- The subdivision has to be able to allow local clearance tests



# Detecting Disturbances

- Given a traversal  $\tau_{abc}$ 
    - traversal  $\tau_{bcd}$  possible
    - $v$  is connected to  $c$
- $v$  is a disturbance to traversal  $\tau_{abc}$  if:
1.  $v$  can be orthogonally projected on  $ac$ ,
  2.  $v$  is not shared by two collinear constraints,
  3.  $dist(v,s) < cl(a,b,c)$ , and
  4.  $dist(v,s) < dist(v,c)$ .

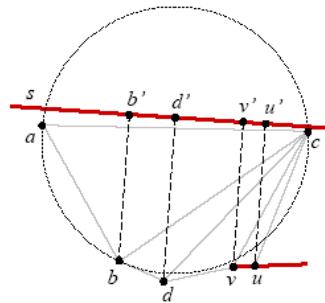


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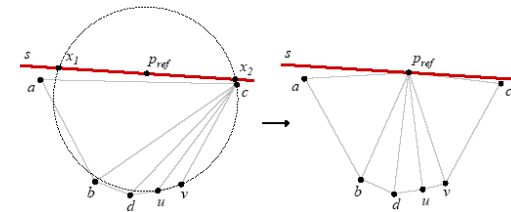
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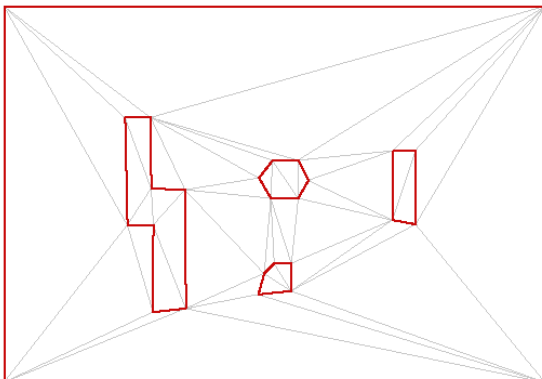
# Computing LCTs

- Check all traversals
- Every time a disturbance is found
  - Subdivide traversal
  - One good refinement point is the mid point between  $x_1$  and  $x_2$ , which are the intersections of  $s$  and circle ( $uvc$ )



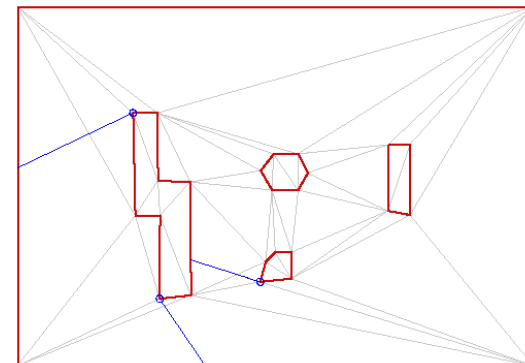
# Computing LCTs

- Starting Point: CDT



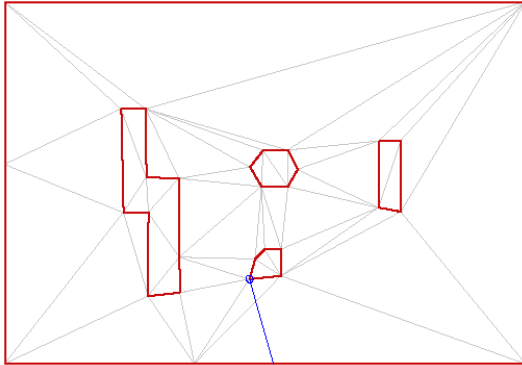
# Computing LCTs

- Iteration 1: Detect all disturbances and refine them



## Computing LCTs

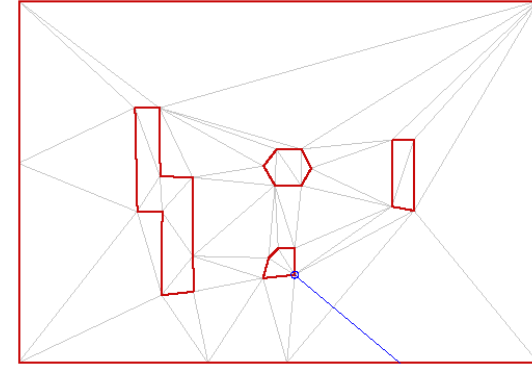
- Iteration 2: Repeat until no more disturbances



<http://graphics.ucmerced.edu/>

## Computing LCTs

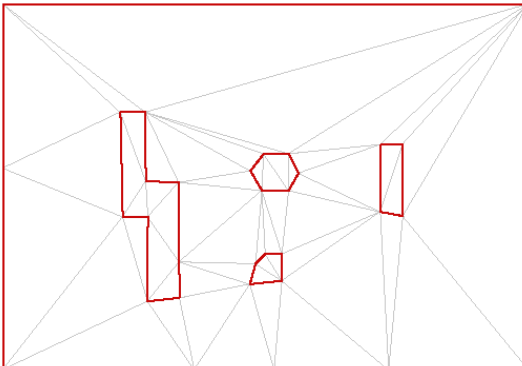
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<http://graphics.ucmerced.edu/>

## Computing LCTs

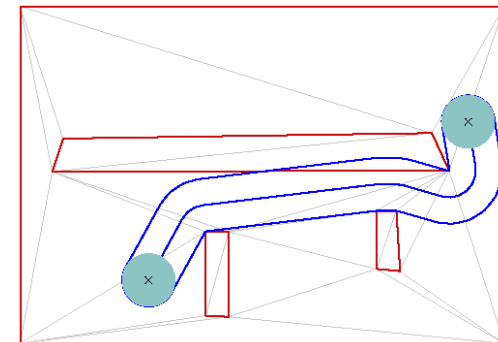
- Iteration 4: no more disturbances: LCT found



<http://graphics.ucmerced.edu/>

## CDT

- Example 1



<http://graphics.ucmerced.edu/>



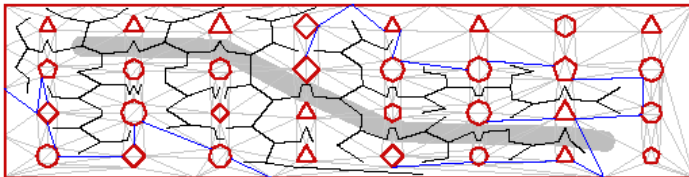
## 2. Channel Search

## Channel Search

- First, locate initial point  $p$ 
  - If not already known, use oriented walk method
- Graph search on the adjacency graph
  - For each triangle traversed, check clearance
  - $O(n \log n)$  if priority queue used
  - $O(n)$  possible
    - By exploiting the planarity of the graph
    - Linear-time shortest path algorithm available
      - Henzinger, Klein, Rao, Subramanian, "Faster Shortest-Path Algorithms for Planar Graphs" 1977, 1994

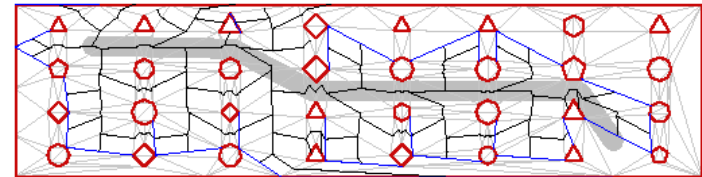
## Adjacency Graph

- Metric 1: Use center of triangles
  - Not good: too many zig zags



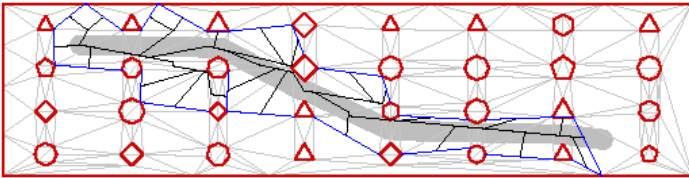
## Adjacency Graph

- Metric 2: Use center of edges
  - Much better



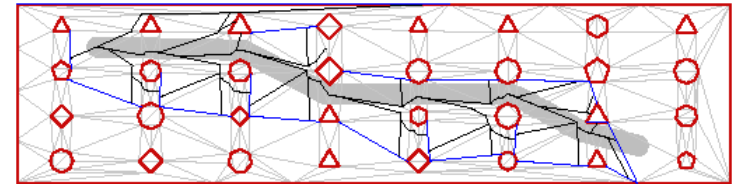
## Adjacency Graph

- Metric 3: adds a visibility criterion to the goal to not miss straight line solution paths
  - It is always important to not miss straight line solutions



## Adjacency Graph

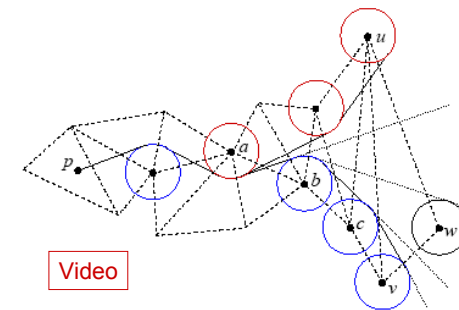
- Metric 4: improves previous metric by considering clearance value
  - A good metric without considering more time-consuming strategies (like backtracking)



Video

## 3. Paths from Channels

- Given a channel connecting  $p$  and  $q$ 
  - Navigation mesh already gives channel triangulated
- Find Shortest path in the channel
  - Funnel algorithm is efficient:  $O(h)$ ,  $h$  length of channel



Video

## 4. Optimal Search

## Optimal Search

- Extended algorithm needed for finding the global optimal
  - First find the locally shortest path, use its length as a current solution upper bound
  - Then run new search, where each front maintains a funnel
    - Each front maintains lower and upper bounds for all path lengths passing by the front's funnel
  - Allow fronts to overlap when needed, a front dies when it may not lower current solution length

## Optimal Search

- Example: environment with high branching factor:  $O(n)$  junctions
  - Many overlaps may occur



## Optimal Search

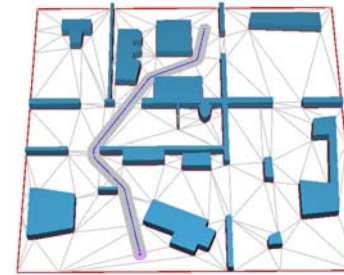
- A more standard environment: very few overlaps



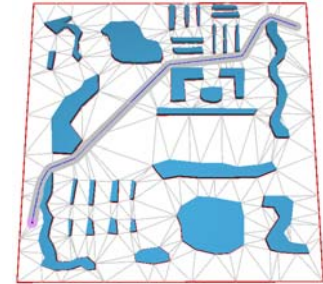
# Results

# Test Environments

env1, n=171

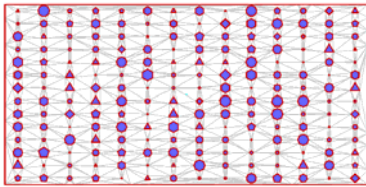


env2, n=313

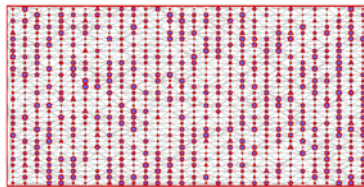


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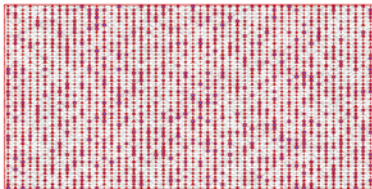
obst1k



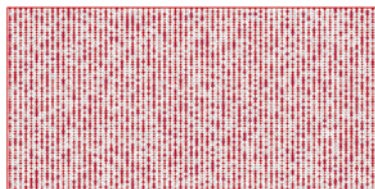
obst5k



obst15k

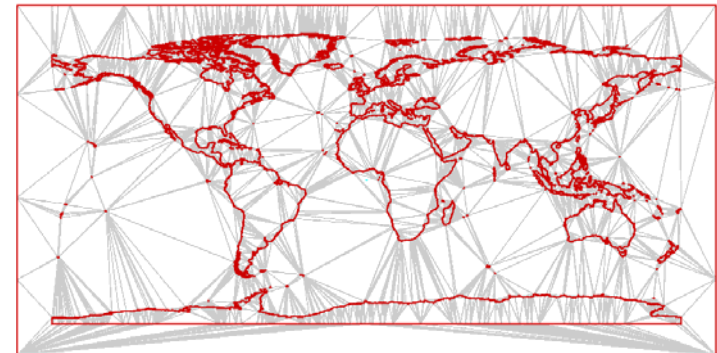


obst30k



# Test Environments

World map with large variation of triangle sizes, n=63K



# Performance

environment	n	refinements	LCT triangles	$t_{local}$ (ms)	$t_{global}$ (ms)	$len_{local}$	$len_{global}$
env 1	171	16	333	0.09	0.22	8.75	8.74
env 2	313	29	687	0.11	0.29	55.8	55.7
obst1k	1207	19	2455	0.19	1.48	159.6	159.4
obst5k	5550	44	11191	0.49	13.51	156.4	156.1
obst15k	14963	88	30105	1.49	62.88	164.5	164.0
obst30k	29198	105	58609	2.28	206.99	168.1	167.6
world map	63426	2198	131247	3.11	401.92	212.0	210.1

(Intel Quad Core Q 9450 @ 2.66 GHz)

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Relatively few LCT refinements needed

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Locally shortest paths computed very efficiently

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Globally shortest paths require more computation time

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Locally shortest paths are very close to the globally shortest ones

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More variation observed when triangles have "irregular sizes"

## Conclusions and Final Remarks

## Main Conclusions

- LCTs give a correct methodology for extracting paths of arbitrary clearance directly from the LCT mesh
- Locally shortest paths are obtained efficiently and in optimal times
  - Preprocessing:  $O(n^2)$ , maybe  $O(n \log n)$
  - Query time:  $O(n)$ , current implementation  $O(n \log n)$

## Proofs will be Available Soon

- T1: Marking cells may not block corridors
  - CDT property guarantees it
- T2: Refinement indeed solves disturbance
  - Due location of  $p_{ref}$  and CDT properties
- T3: LCT remains with  $O(n)$  triangles
  - Bounded internal angle and prevention of propagations
- T4: Local clearance tests and special cases are enough
  - Concatenation of traversals shows it

## Extensions and Variations

- Many extensions possible
  - Corridors without junctions can be reduced to one link in the adjacency graph
  - Handling additional properties: non-flat terrains, multi-layers, etc
  - Reactive behaviors based on path queries
- Navigation Meshes are very useful
  - Ray sensors easily computed
  - Intersection tests for placement of disc-agents, etc
- Many of these tools already implemented
  - Implementation code to be available soon
  - Please keep checking our web site

## Final Notes

- Not all references in these slides are in the paper
- Project page will maintain latest info
  - <http://graphics.ucmerced.edu/>

Video

## Thank You