Trijkstra

A Dijkstra algorithm application to path planning

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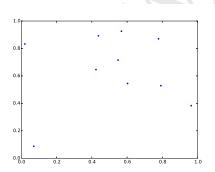
4 December 2015



Voronoi diagrams

Input: A set of points in plane (or space) called sites

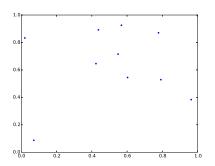
Output: A partition of the plane (or space) such that each point of a region is nearer to a certain site respect to the others

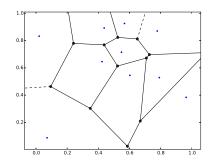


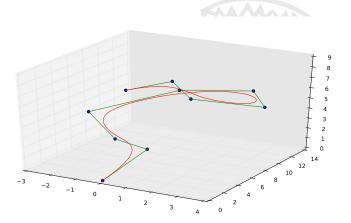
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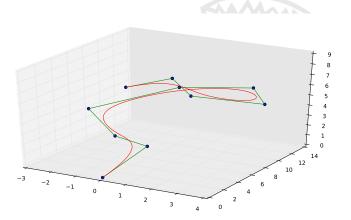
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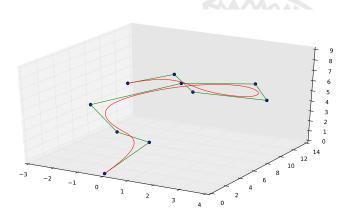




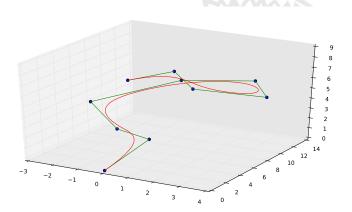
- √ parametric curves
- √ follow the shape of a court of poligon
 - can interpolate the extremes of the control polygon



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Dijkstra algorithm

```
def dijkstra(graph, start, end):
       path = []
       Q = priorityQueue.PQueue()
       dist = {}
       prev = {}
 6
       for node in graph.nodes(): #populate the queue
         if node != start:
 8
           dist[node] = inf
           Q.add(node, inf)
         else:
           dist[node] = 0
12
           Q.add(node, 0)
       while True: #main loop
14
         u = Q.pop() #take nearest node and remove from queue
         if u == end or dist[u] == inf: #finished (good or bad)
           break
         #all neighbors still in queue
         for v in Q.filterGet(lambda node: node in graph.neighbors(u)):
19
           tmpDist = dist[u] + graph[u][v]['weight']
20
           if tmpDist < dist[v]: #if distance shorter update values
21
22
             dist[v] = tmpDist
             prev[v] = u
23
             Q.add(v, tmpDist) #update distance also in queue
24
       n = end
25
26
       while u in prev: #backward recreation of path
           u = prev[u]
           path[:0] = [u]
28
29
       if path:
           path[len(path):] = [end]
           path[:0] = [start]
       return path
```

Main problem

- 1. Distribute points in the surfaces of obstacles
 - and optionally in the surface of bounding box
- 2. Build Vorgnoi diagram using those points as source
- 3. Transform the Voronoi diagram in a graph
 - cells vertexes as nodes
 - cells edges as arcs (infinite edges ignored)
- 4. Prune the arcs that crosses an obstacle's surface
- 5. Attach the start and end points to the graph as nodes
- 6. Calculate the shortest path from start node to end node using Dijkstra's algorithm.

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Path planning from a start point to an end point in 3D space with obstacles using Voronoi diagrams.

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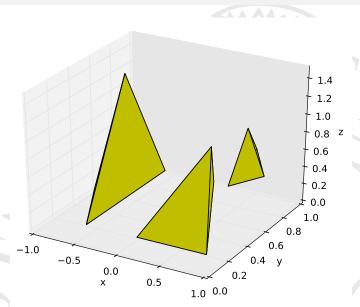
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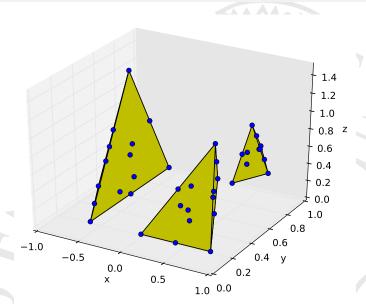
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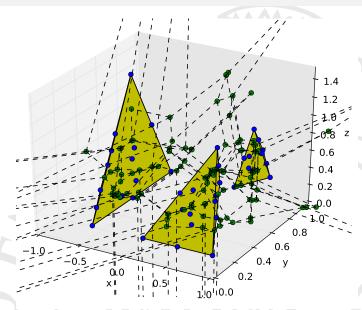
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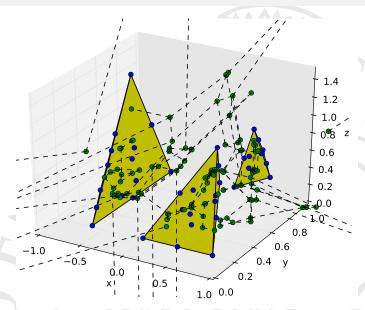
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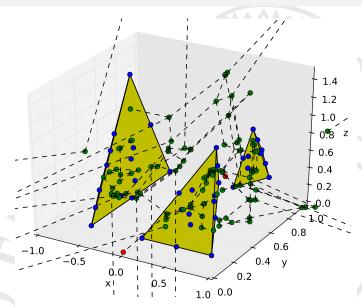
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Idea

- we can use a Spline that
 - ▶ interpolate the start and end vertexes
 - use the shortest path found with Dijkstra as control polygon

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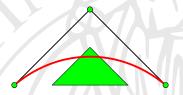
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✓ A B-Spline of order *n* is contained inside the union of convex hulls composed of consecutive *n* vertexes of control polygon

- \checkmark we can use a quadratic B-Spline (grade 2, order 3) to smooth the path
- √ and keep triangles formed by three consecutive points free from
 obstacles

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 - ▶ the initial weight is 0 for triples where the first node is the start node
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 - ▶ a triple B is subsequent to a triple A if $(A[2] = B[1]) \land (A[3] = A[2])$
 - ▶ the weight of a neighbour is $\mathcal{N}(S) = \mathcal{N}(A) + dist(A[1], A[2])$
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Declarations & Triples creation

```
def _trijkstra(self, startA, endA):
    start = tuple(startA)
    end = tuple(endA)
    endTriplet = (end,end,end) #special triplet for termination
    inf = float("inf")
    path = []
    Q = priorityQueue.PQueue()
    dist = {}
    prev = {}
    hits = []
```

```
for node0 in self._graph.nodes():
         for node1 in self._graph.neighbors(node0):
           for node2 in filter(lambda node: node!=node0, self, graph.neighbors(node1)):
             triplet = (node0, node1, node2)
             if not triplet[::-1] in hits:
               if not self. triangleIntersectPolyhedrons(np.array(node0), np.array(node1),
                    → np.array(node2)):
                 if node0 != start:
                   dist[triplet] = inf
                   Q.add(triplet, inf)
                 else:
                   dist[triplet] = 0
                   Q.add(triplet, 0)
13
               else:
14
                 hits[:0] = [triplet]
      dist[endTriplet] = inf
       Q.add(endTriplet, inf)
```

Main loop

```
while True:
       u = Q.pop()
       if u == endTriplet or dist[u] == inf:
        break
       for v in Q.filterGet(lambda tri: u[1] == tri[0] and u[2] == tri[1]):
 8
         tmpDist = dist[u] + self._graph[u[0]][u[1]]['weight']
 9
         if tmpDist < dist[v]:</pre>
           dist[v] = tmpDist
           prev[v] = u
           Q.add(v, tmpDist)
13
114
       if u[2] == end:
15
         tmpDist = dist[u] + self._graph[u[0]][u[1]]['weight'] +

    self._graph[u[1]][u[2]]['weight']

         if tmpDist < dist[endTriplet]:
17
           dist[endTriplet] = tmpDist
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Path creation

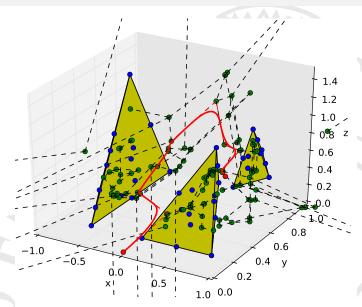
```
u = endTriplet
while u in prev:
  u = prev[u]
 path[:0] = [u[1]]
if path:
  path[len(path):] = [end]
  path[:0] = [start]
return np.array(path)
```

Path creation

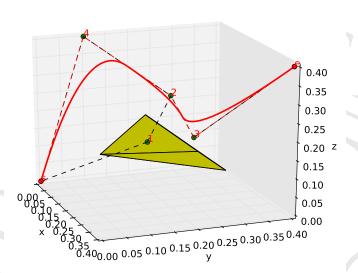
After

we can use the returned path as a control polygon for a quadratic B-Spline without problems, and construct a smoother path.

Previous example



Clearer example



- √ the original graph is not directed and weighted
- √ the transformed graph is directed and weighted, and
 - if A and B are neighbouring and B and G are neighbouring, in the original graph
 - we have two nodes (A, B, B) and (C, B, A) in the transformed graph
 - ▶ a node (A_1, B_1, C_1) is a predecessor of (A_2, C_2, C_2) in the transformed graph if $B_1 = A_2$ and $C_1 = B_2$ in the original graph
 - ▶ and the weight of the arc is the weight of the original from A₁ to
 - $B_1 (= A_2)$

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- \checkmark Suppose that the graph has a maximum degree k
 - ▶ each node has maximum k reighbours
- Each node is the central point of $2 \cdot {k \choose 2} = k \cdot (k+1)$ triples
 - $|V_{mod}| = |V_{orig}| \cdot k (k-1) = O(k^2 |V_{orig}|)$
- ✓ Each triple is a predecessor of k-1 triples
 - $|E_{mod}| = |V_{mod}| (k-1) = \mathcal{O}(k|V_{mod}|) = \mathcal{O}(k^3|V_{olig})$
- √ Cost of Dijkstra:
 - $\mathcal{O}(|E_{mod}| + |V_{mod}| \log |V_{mod}|) \neq \mathcal{O}(|k^3| |V_{olig}| + |k^2| |V_{olig}| \log (|k| |V_{orig}|))$
- \checkmark Negligible cost for triples creation: $V_{oig} | k \cdot (k-1) = \mathcal{O}(k^2 | V_{orig} |$

- \checkmark Suppose that the graph has a maximum degree k
 - ► each node has maximum k neighbours
- ✓ Each node is the central point of $2 \cdot {k \choose 2} = k \cdot (k-1)$ triples
 - $|V_{mod}| = |V_{orig}| \cdot k (k-1) = 0 (k^2 |V_{orig}|)$
- \checkmark Each triple is a predecessor of k = 1 triple
 - $|E_{mod}| = |V_{mod}| (k-1) = \mathcal{O}(k|V_{mod}|) = \mathcal{O}(k^3|V_{olig})$
- √ Cost of Dijkstra:
 - $\mathcal{O}(|E_{mod}| + |V_{mod}| \log |V_{mod}|) \neq \mathcal{O}(k^3 |V_{olg}| + k^2 |V_{olg}| \log (k|V_{orig}|))$
- \checkmark Negligible cost for triples creation: $V_{oig}|k\cdot(k-1)=\mathcal{O}(k^2|V_{orig}|)$

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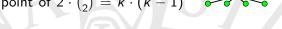
$$|E_{mod}| = |V_{mod}| (k-1) = O(k|V_{mod}|) = O(k^3|V_{olig}|)$$

√ Cost of Dijkstra;

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$$|E_{mod}| = |V_{mod}| \cdot (k-1) = \mathcal{O}(k|V_{mod}|) = \mathcal{O}(k^3|V_{orig}|)$$

✓ Cost of Dijkstra:

$$\mathcal{O}(|E_{mod}| + |V_{mod}|\log|V_{mod}|) = \mathcal{O}(k^3|V_{orig}| + k^2|V_{orig}|\log(k|V_{orig}|))$$

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If k is constant (don't grow with $\lfloor V_{orig} \rfloor$

- ✓ Total cost: $O(|V_{orig}|\log|V_{orig}|)$
- √ same cost of Dijkstra in a lattice

If the graph is a clique

- $\sqrt{k} = |V_{orig}| 1$
- ✓ Total cost: $\mathcal{O}(|V_{orig}|^4)$

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Questions? Thank you.



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