

Generating Geometric Objects I: Basics

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Generating Geometric Objects

Input:

Points, lines, planes, halfspaces, spheres, ...

Output:

Vertices, intersection points, triangulation, Voronoi diagram, cells,
faces,

Difficulties:

Output size may be huge, degeneracy, numerical errors

Typical Problems

Triangulation:

Generate all triangulations on a given point set

Euclidean Spanning Trees:

Generate all planar spanning trees on a given set of points

Laman frames:

Generate all Laman frames on a given point set

Arrangements:

Generate all the cells or vertices of an arrangement of lines, planes or hyperplanes

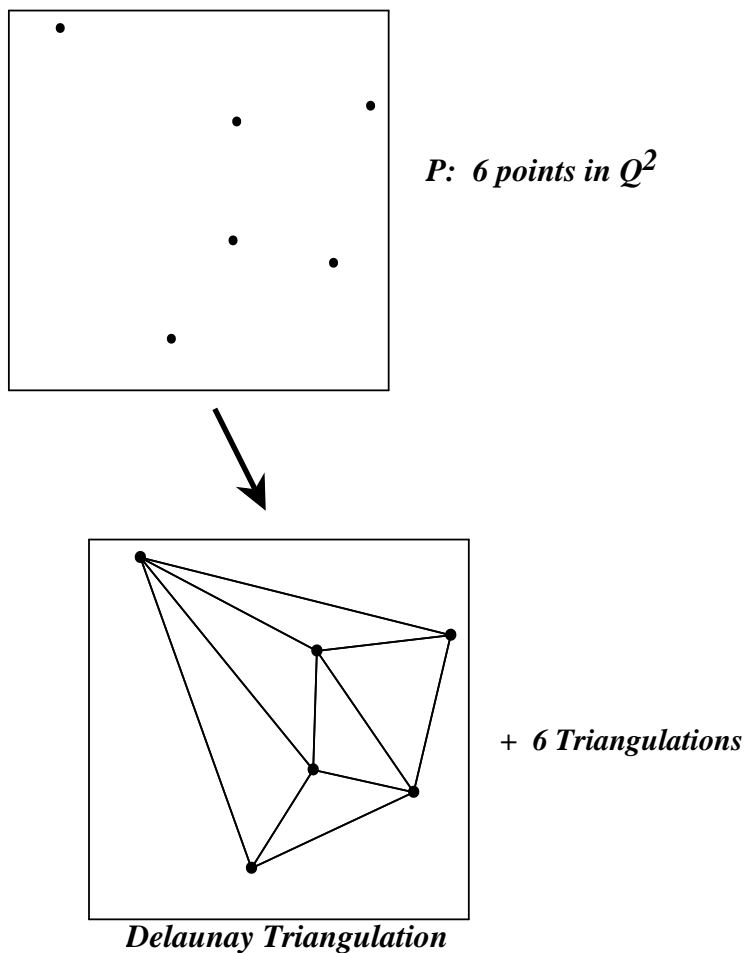
Convex Hull:

Generate the vertices or facets of a convex polyhedron

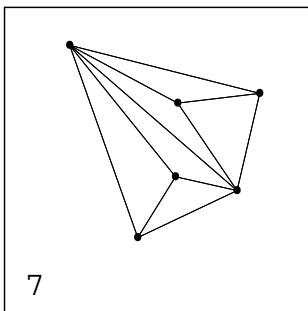
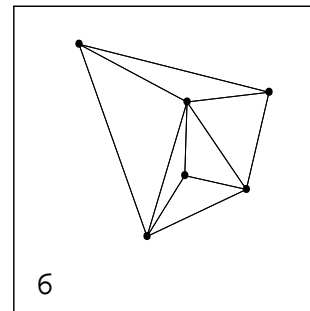
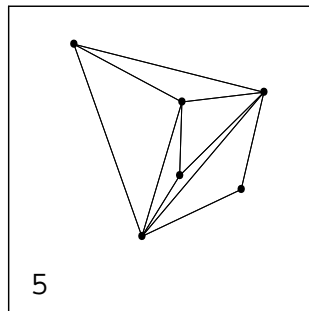
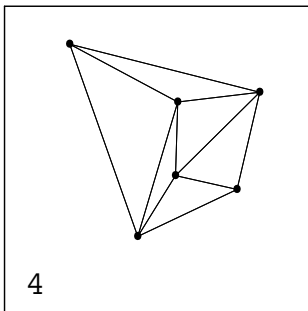
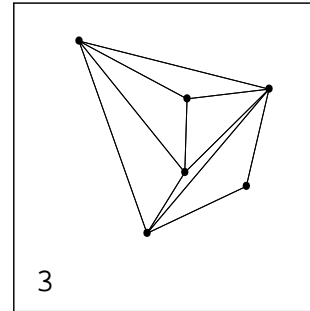
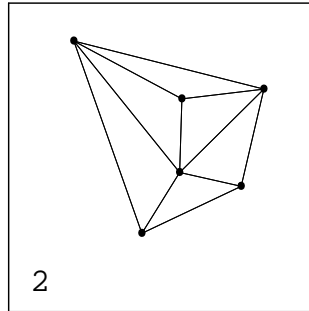
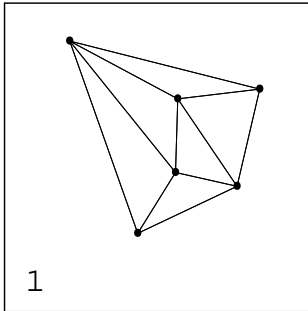
Problem: Triangulations of a point set

Input: A planar set P of n points

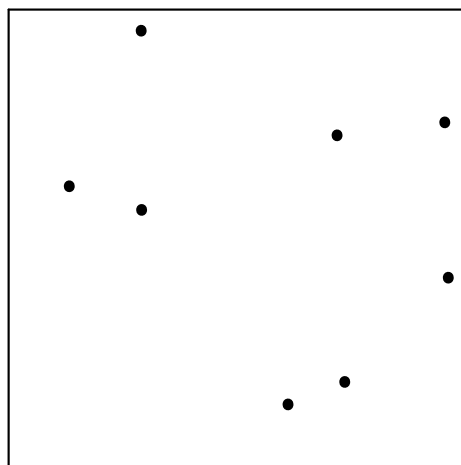
Output: The set of all triangulations of P .



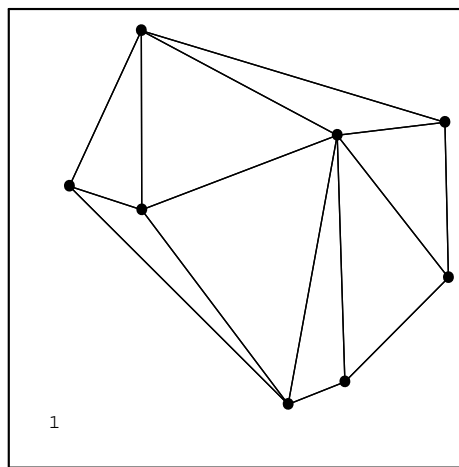
All triangulations on these 6 points:



Instance with 8 points:



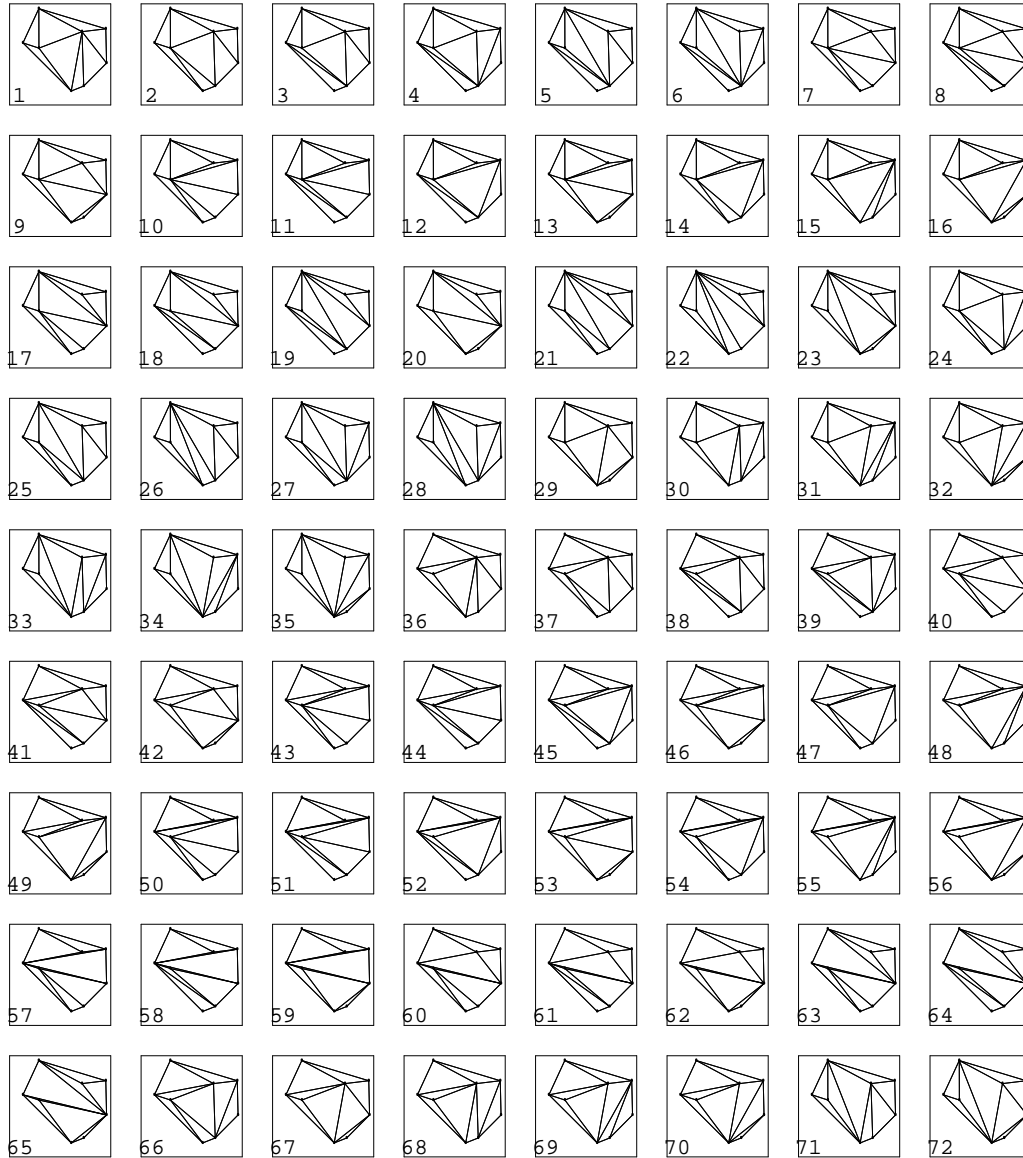
P: 8 points in Q^2



+ 71 Triangulations

Delaunay Triangulation

All triangulations on these 8 points:



Problem: Permutations of $\{ 1,2,\dots,n \}$

Input:

Integer $n = 3$

Output:

1 2 3

1 3 2

2 3 1

2 1 3

3 1 2

3 2 1

Output size: $n! = 6$

Basic Idea: Graph Search

Define a **connected** graph $G = (V, E)$ where:

- V are the objects to be generated
- E are defined implicitly by an **adjacency oracle**

Informally, the oracle generates all objects similar to a given object.

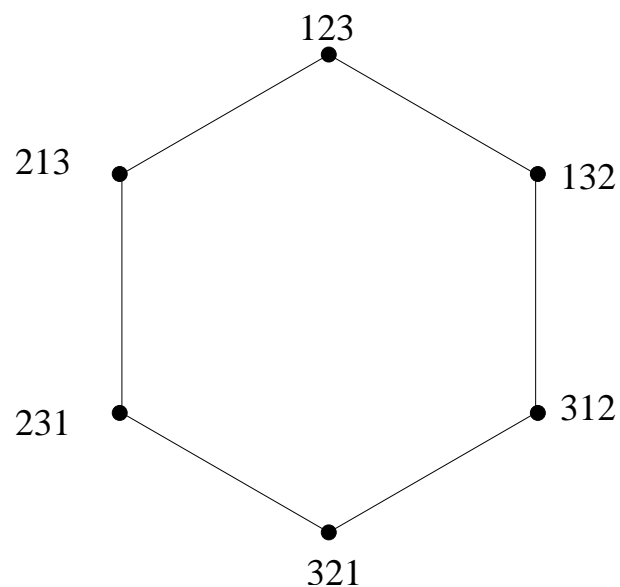
Let Δ denote the **maximum degree** of G .

Adjacency oracle: Permutations

Let $\pi = (\pi_1, \pi_2, \dots, \pi_n)$ where $\{\pi_1, \pi_2, \dots, \pi_n\} = \{1, 2, \dots, n\}$

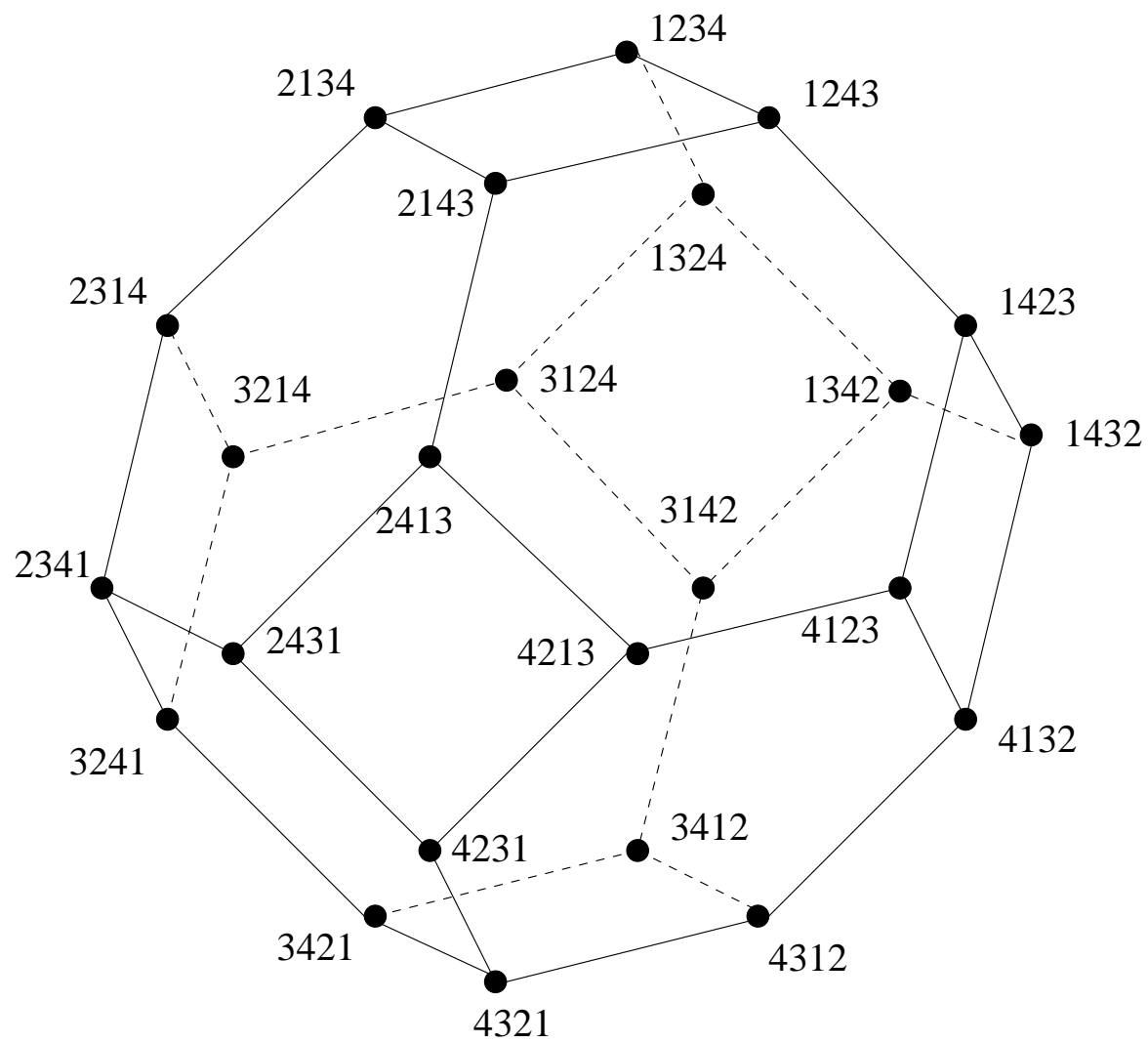
$$Adj(\pi, i) = (\pi_1, \pi_2, \dots, \pi_{i-1}, \pi_{i+1}\pi_i, \dots, \pi_n) \quad \text{for } i = 1, 2, \dots, n - 1$$

$$\Delta = n - 1$$



Eg. $n = 3$

Permutahedron ($n = 4$)



ADJACENCY ORACLE

$G = (V, E)$ $\Delta = \text{maximum degree}$

For every $x \in V$ $i = 1, 2, \dots, \Delta$

$$Adj(x, i) = \begin{cases} y & \text{where } xy \in E \\ \phi & \text{otherwise} \end{cases}$$

Key Property:

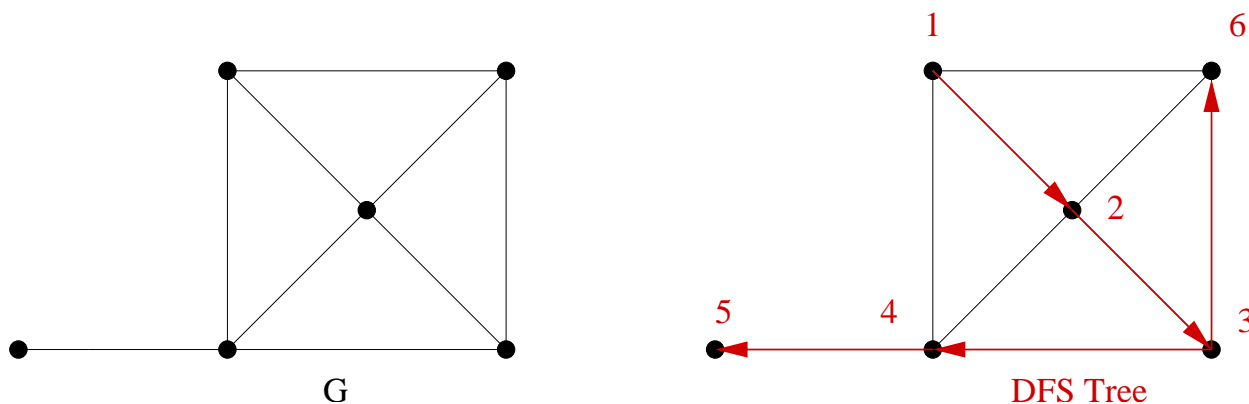
For every edge xy in G there is a unique i s.t.

$$y = Adj(x, i)$$

How to Search the Graph?

Depth First Search (DFS) explores a graph by:

- Labelling a given starting vertex
- Finding and labelling a vertex adjacent to last labelled vertex
- Backtracking when there are no more edges from a given vertex



Disadvantages:

- All labelled vertices need to be stored
- A stack is needed for backtracking

Space Efficient Graph Searching - I

Gray Code Method: (Wilf, Read, ...)

- Traverse a **Hamiltonian cycle** in the graph
- Can be initiated from any vertex
- *Next* function gives a unique successor to each vertex
- Useful for highly structured problems

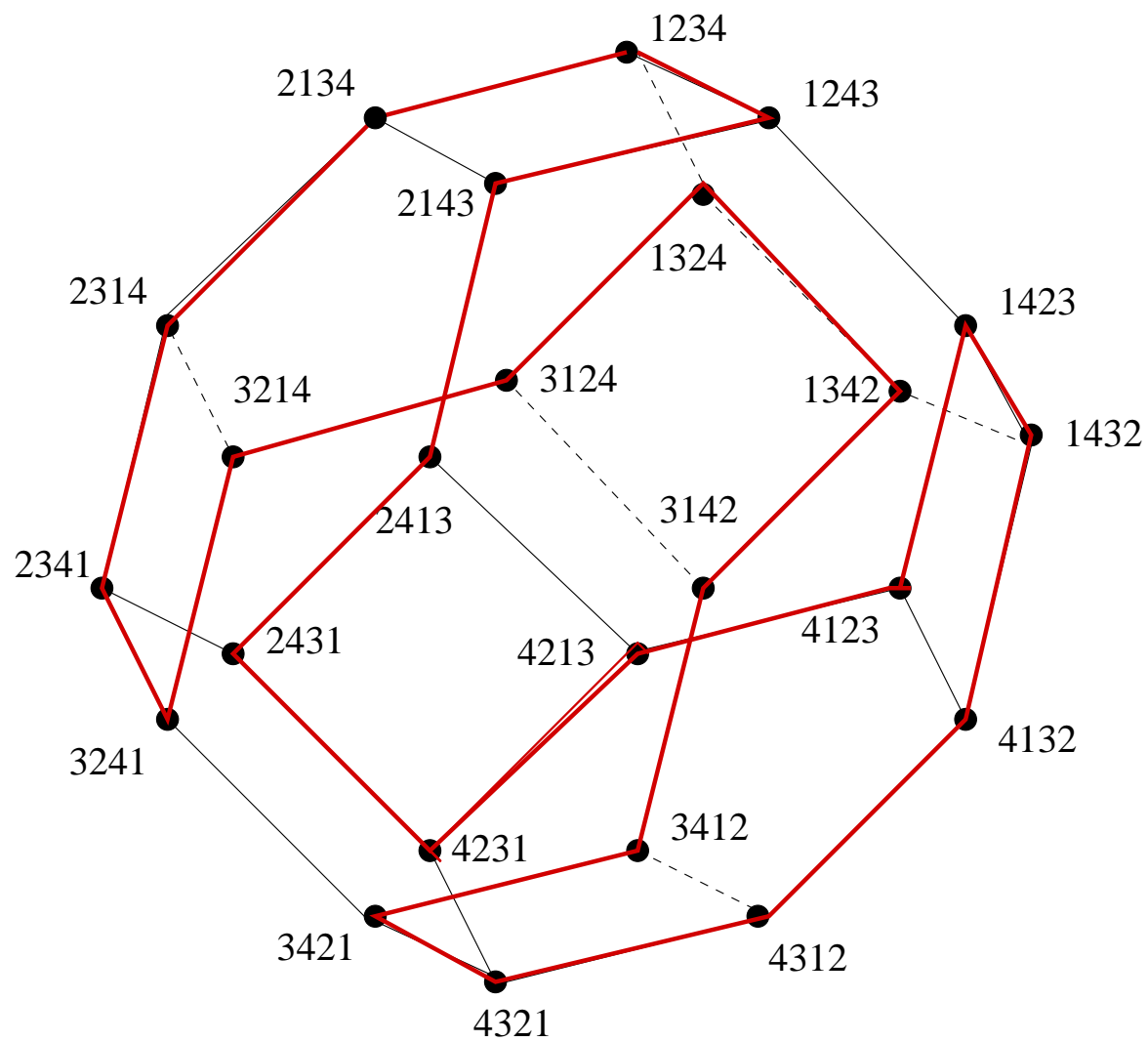
Disadvantages:

- Underlying graph may not be Hamiltonian
- Finding a cycle may be hard

Examples:

- subsets of a set, permutations, binary trees, ...

Hamilton Cycle on the Permutahedron



Space Efficient Graph Searching - II

Reverse Search Method: (Avis-Fukuda(91), ...)

- Traverse a **spanning tree** in the graph
- Initiated from the root (target)
- **Local search** gives a unique **parent** for each non-root
- Useful for unstructured problems, especially geometric
- Little or no extra storage required

Disadvantages:

- Parent and/or Adjacency may be expensive to compute
- Wasteful if graph is dense

Examples:

- triangulations, arrangements, vertex enumeration, matchings, Euclidean trees, matroid bases, Laman frames, ...

LOCAL SEARCH

$G = (V, E)$ $S \subseteq V$ set of targets

$f : V - S \rightarrow V$ local search function

Key Properties:

(a) $(v, f(v)) \in E$

(b) The following loop terminates for every $v \in V$:

```
while  $v \notin S$   
  { output  $(v, f(v))$ ;  
     $v = f(v)$ ; }
```

Note:

The above code defines a path in G
from v to some vertex in S .

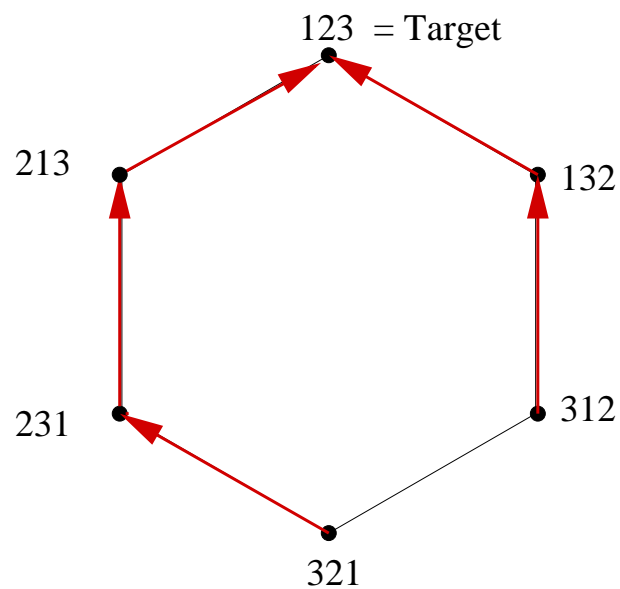
Local Search: Permutations

Let $\pi = (\pi_1, \pi_2, \dots, \pi_n)$ Target: $(1, 2, \dots, n)$

$$f(\pi) = (\pi_1, \pi_2, \dots, \pi_{i-1}, \pi_{i+1}\pi_i, \dots, \pi_n)$$

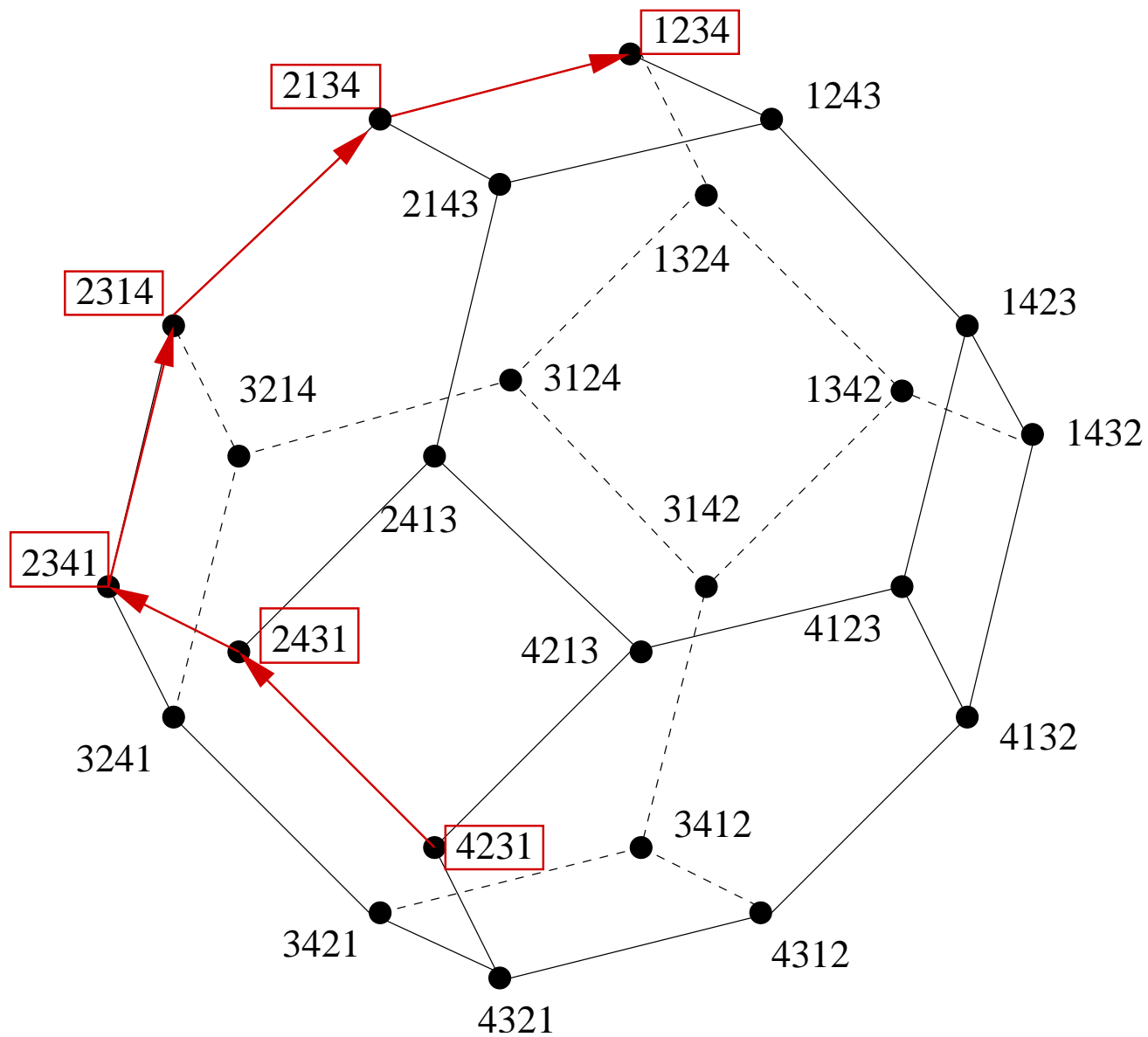
where i is the smallest index for which

$$\pi_i > \pi_{i+1}$$



Eg. $n = 3$

Local search: Permutations ($n = 4$)

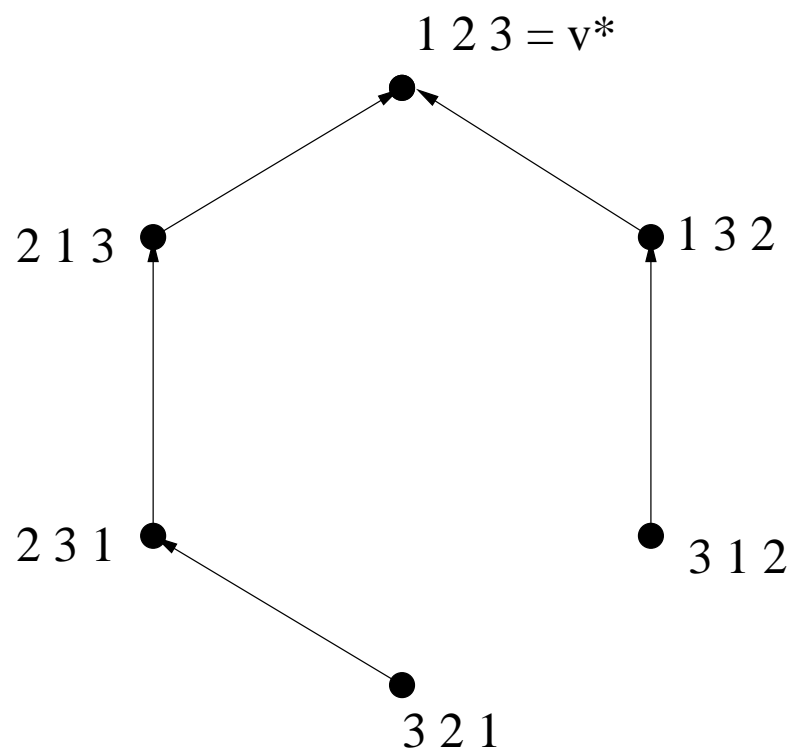
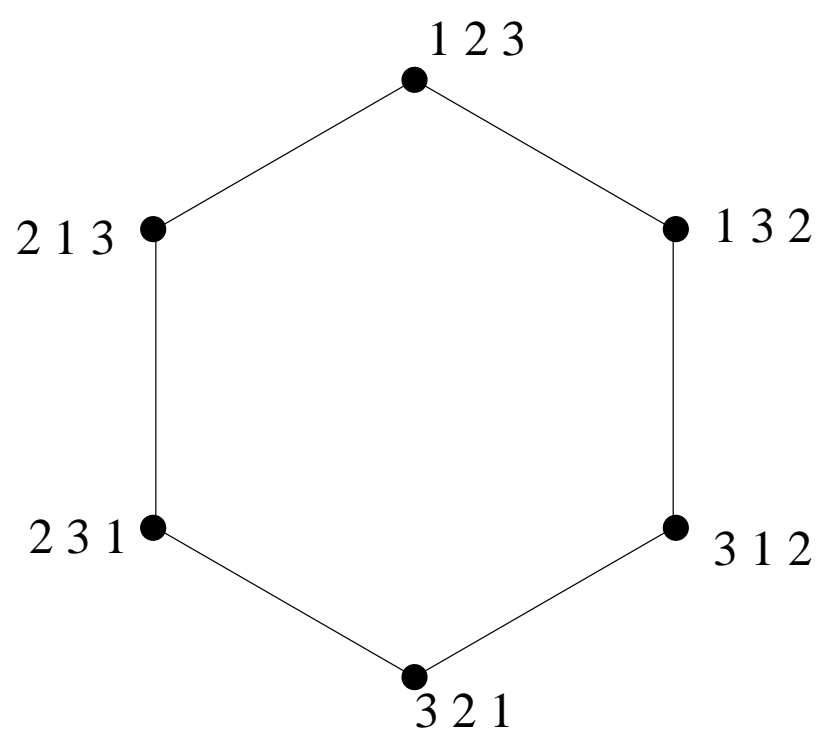


Reverse Search Tree

- The set of all local search paths forms the **reverse search tree**
- The tree is explored depth first from the root (target)
- For $i = 1, \dots, \Delta$, $Adj(x, i)$ is a child of x iff $x = f(Adj(x, i))$
- Backtracking is performed by applying f
- No need to label vertices, as we only explore a tree

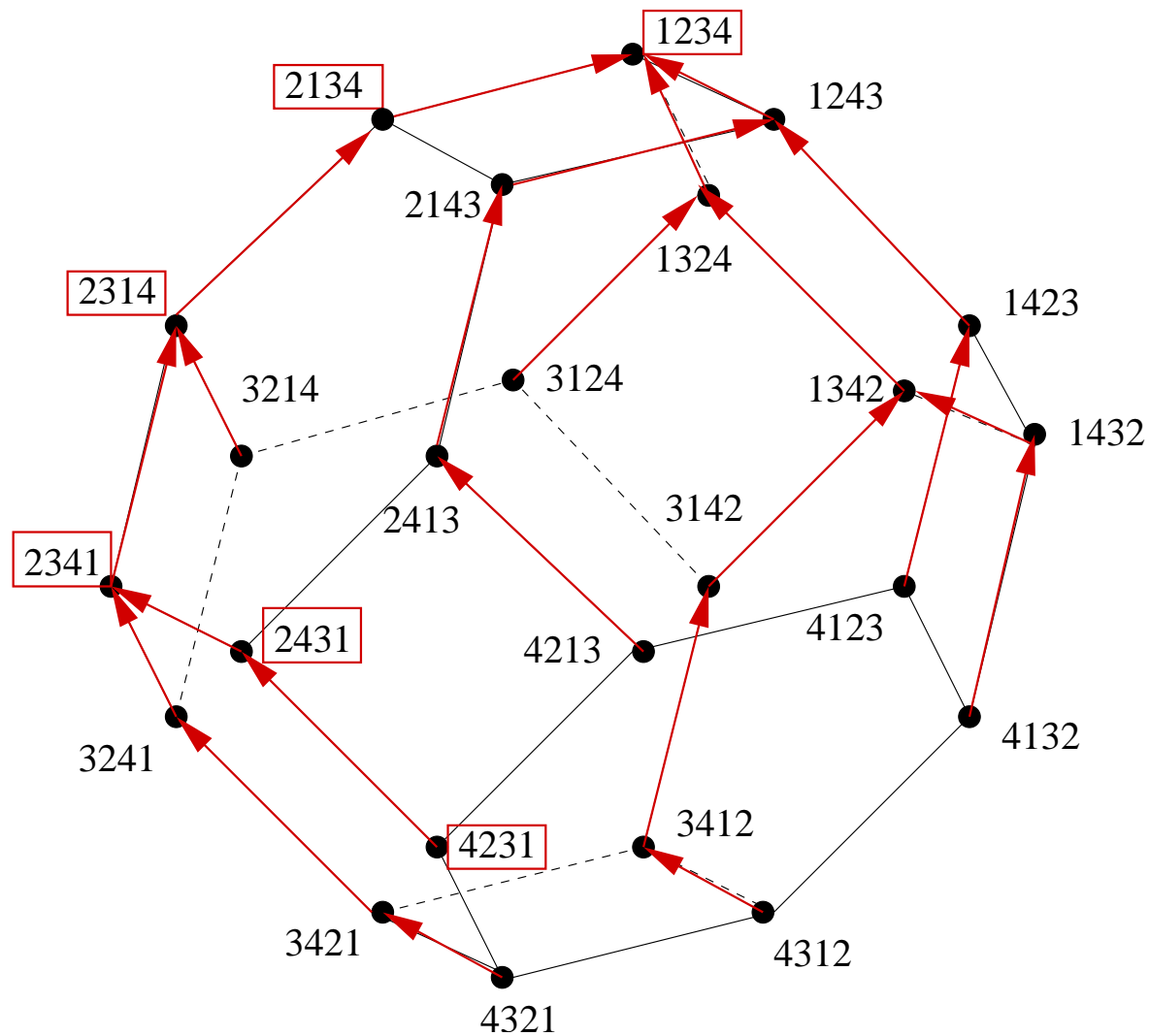
Adjacency and Reverse Search Tree for Permutations

($n = 3$)



Adjacency and Reverse Search Tree for Permutations

($n = 4$)



REVERSE SEARCH

```

for  $s \in S$  do                                //  $S$  is target set
     $v = s$ ;     $j = 0$ ;
    repeat
        while  $j < \Delta$  do                //  $\Delta$  is max. degree
            {  $j++$ ;
              if ( $f(\text{Adj}(v, j)) == v$ )
                  {  $v = \text{Adj}(v, j)$ ; // forward step
                    output  $v$ ;
                     $j = 0$ ; }
            } // end while

            if  $v \neq s$                         // backtrack step
                {  $u = v$ ;   $v = f(v)$ ;
                  find  $j$  s.t.  $\text{Adj}(v, j) = u$  }

    until  $v == s$  and  $j == \Delta$ 

```

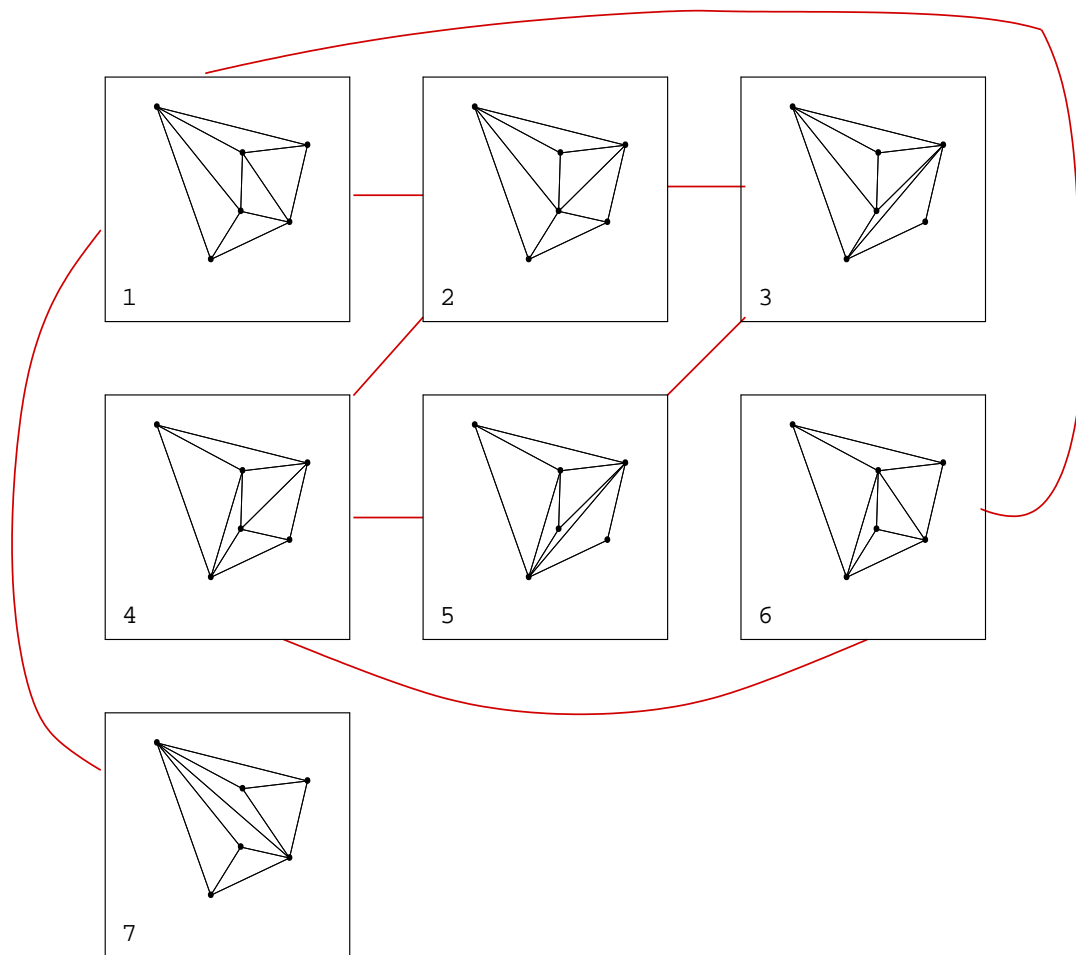
Problem: Generating all Triangulations of a point set

Adjacency: Diagonal flip on convex quadrilateral

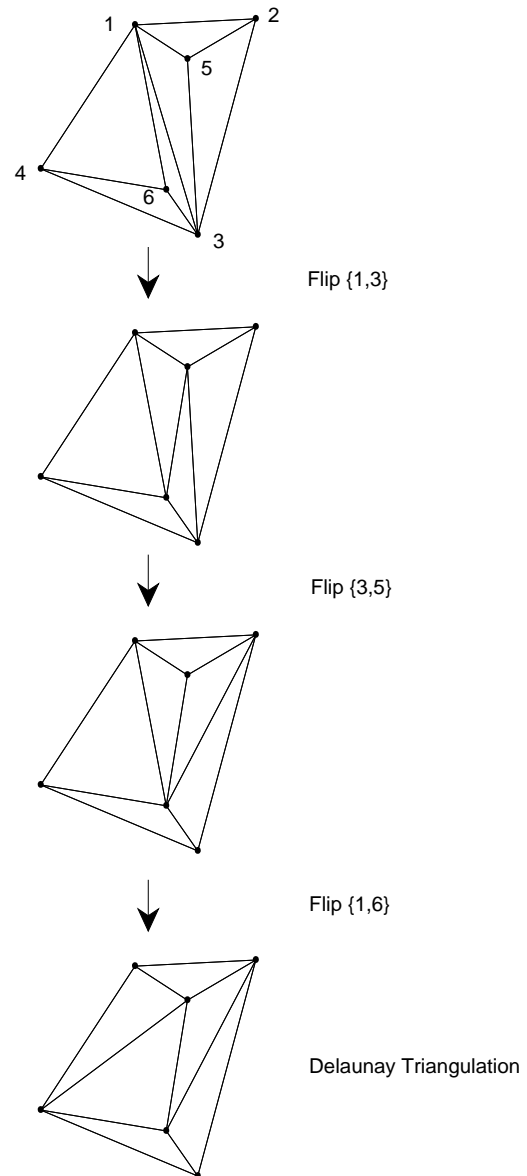
Local search: Lex-min Delaunay edge flip

Target: Delaunay triangulation

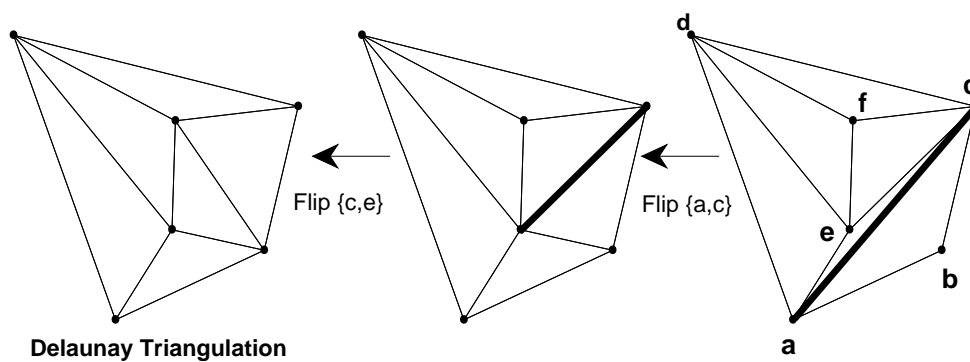
Triangulations: Adjacency by edge flip



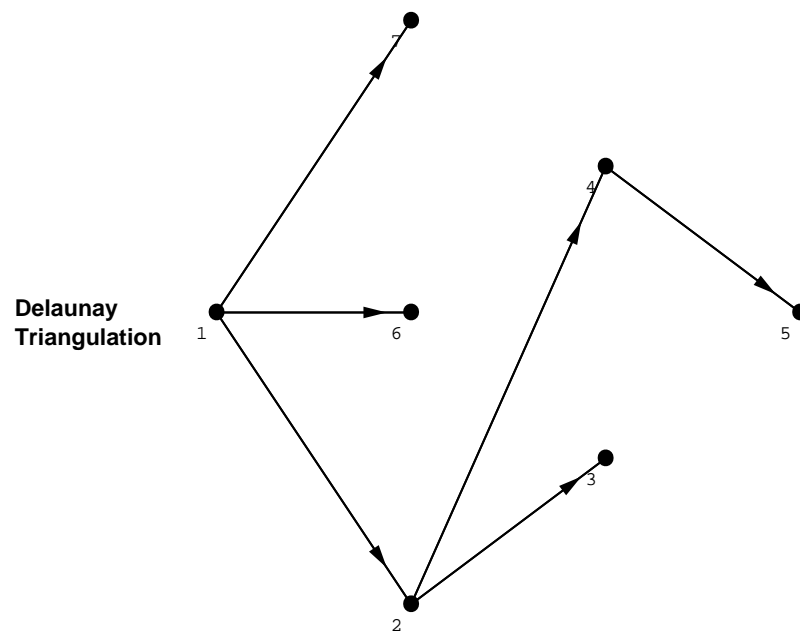
Triangulations: Local search



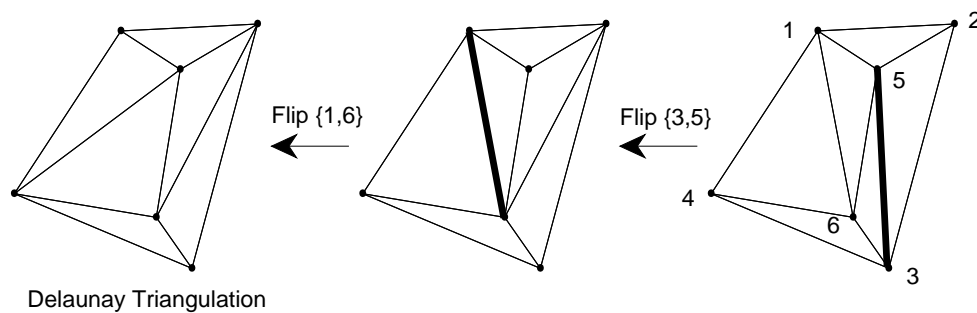
The Flip Algorithm



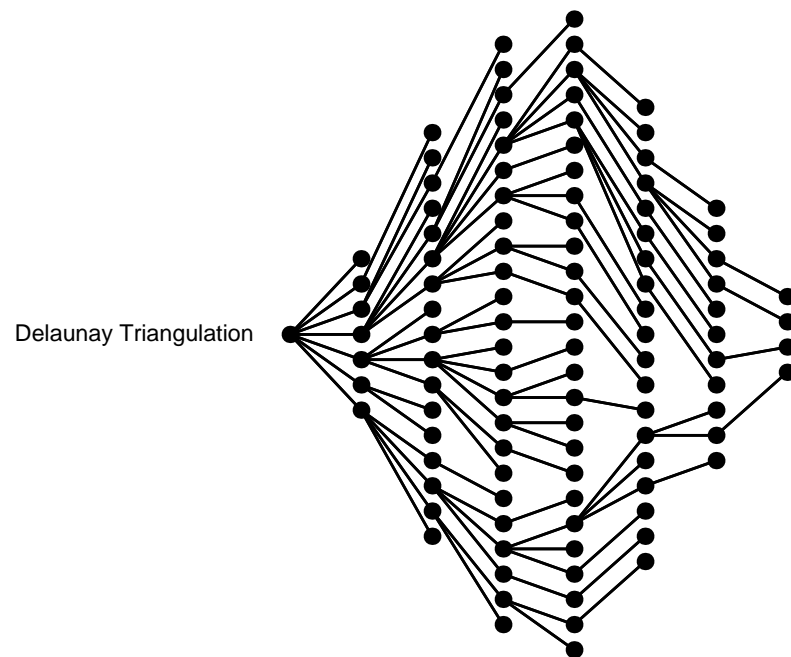
The Reverse-Flip Search Tree for the 6 Points Problem



The Flip Algorithm



The Reverse-Flip Search Tree for the 8 Points Problem



Problem: Constrained Triangulations

Input: A planar set $P = \{1, 2, \dots, n\}$

A set F of edges on P

Output: The set of all triangulations of P that contain F

Solution: Target: Constrained Delanay triangulation

Adjacency: Constrained edge flip

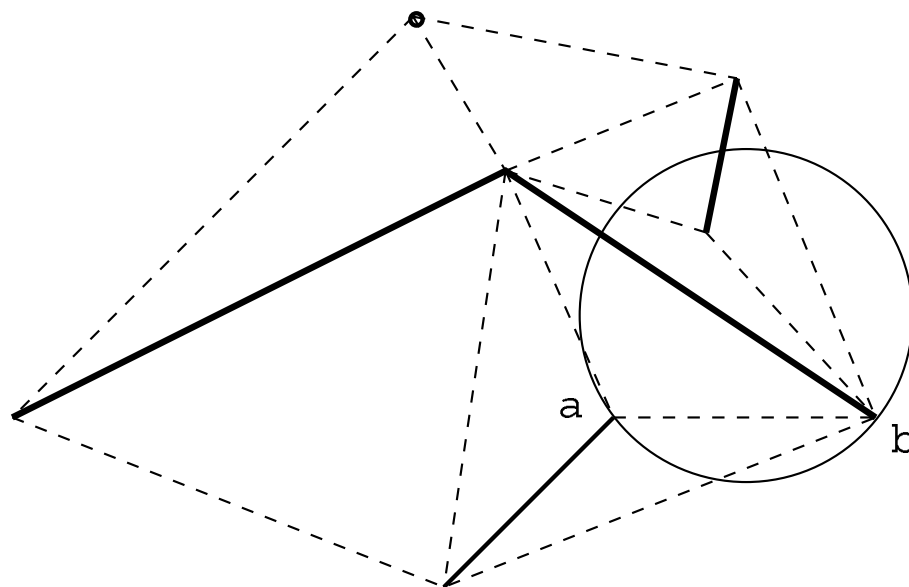


Figure 4. The CDT of a planar straight line graph.

Open Problems: Triangulations

Input: A planar set $P = \{1, 2, \dots, n\}$

A set F of edges on P

Output: All triangulations of P that **do not** contain F

Input: A planar set $P = \{1, 2, \dots, n\}$

Integer k

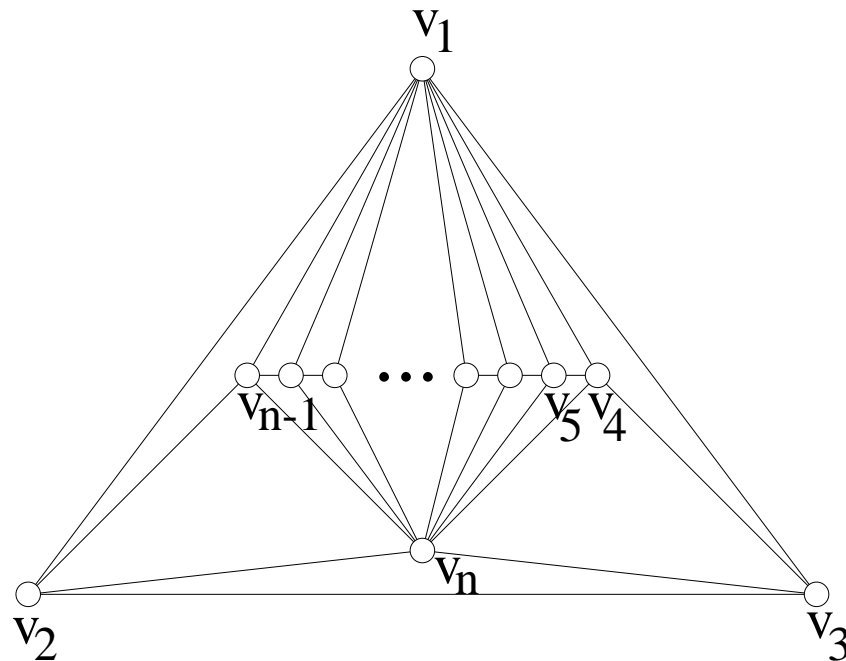
Output: All triangulations of P with **maximum (or minimum)** degree k

Problem: Max Planar Graphs with Min Degree k (MPG_k)

Input: Integers n, k

Output: All rooted MPG_k

Rooted: Outer face labels fixed



$k=3$ All MPG_s

$k=4$ D.A. and M. Kong, 1996

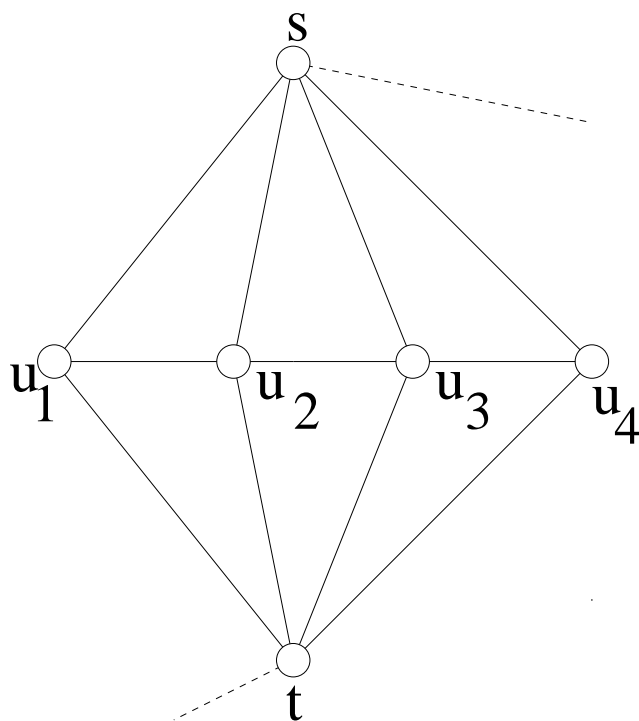
$k=5$ Open

The Number of Maximal Planar Graphs

n	#rooted MPG4	#rooted MPG5	time taken/sec.	#rooted MPG	time taken/sec.
4	-	-	-	1	0
5	-	-	-	3	0
6	1	-	0	13	0
7	3	-	0	68	0
8	12	-	0	399	0
9	59	-	0	2,530	0
10	313	-	0	16,965	0.4
11	1,713	-	0.2	118,668	3.8
12	9,559	1	1.3	857,956	33.0
13	54,189	0	9.2	6,369,883	291.1
14	311,460	6	63.8	?	?
15	1,812,281	13	444.6	?	?
16	10,661,303	55	3042.4	?	?
17	63,336,873	189	20766.9	?	?

Double Flips

$flip(s, u_2)$ leaves $d(u_2) = 3$



After $flip(s, u_2)$ **and** $flip(t, u_3)$ all vertices have min deg 4.

Adjacency Oracle

E is an MPG_4 , and edge $e_j = (a, b)$ bounds $\triangle abc$, $\triangle abd$.

$$\text{Adj}_1(E, j) = \begin{cases} \text{flip}(a, b) & \text{if } (a, b) \text{ is 1-flippable} \\ \emptyset & \text{otherwise} \end{cases}$$

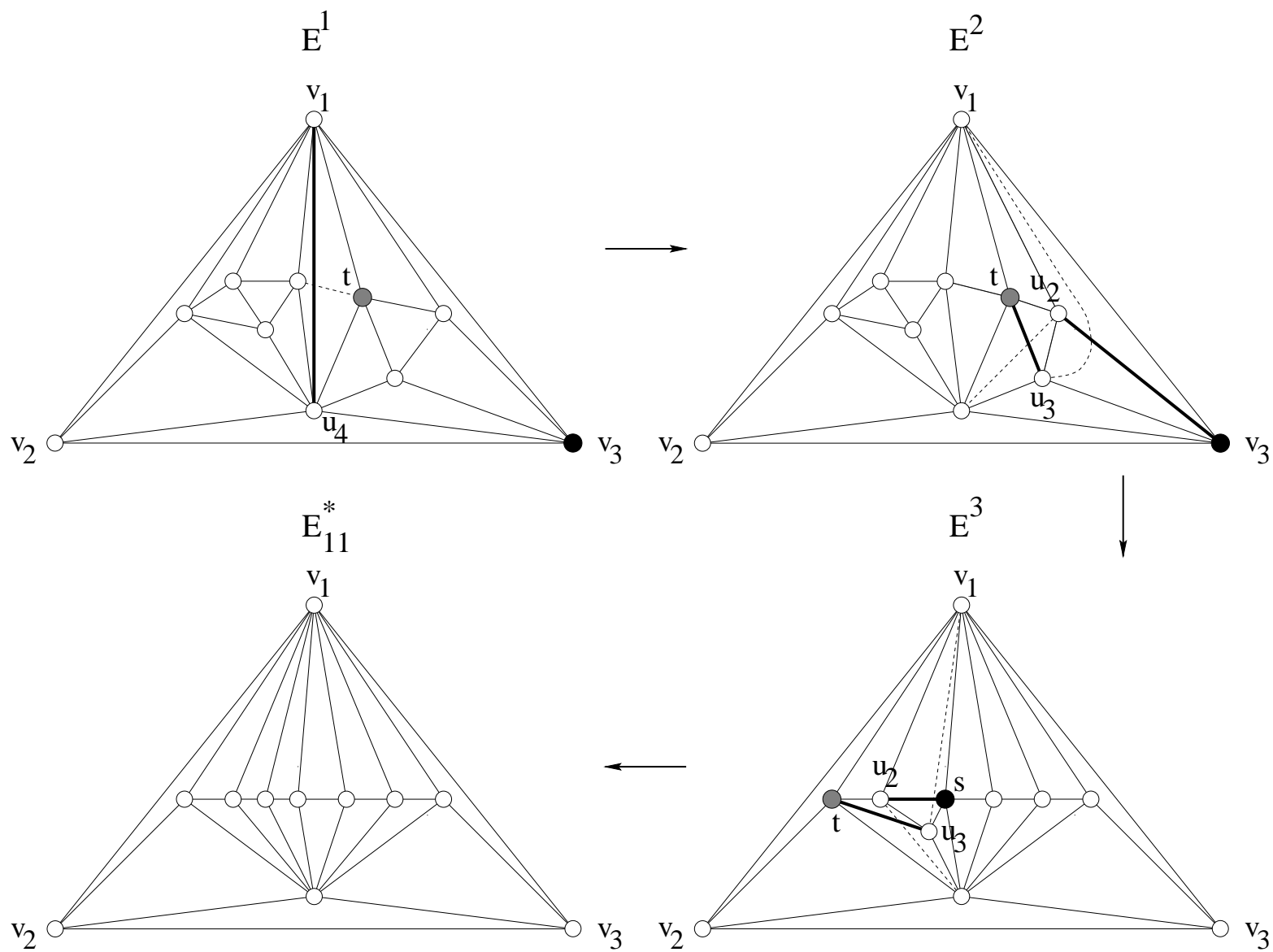
$$\text{Adj}_2(E, j) = \begin{cases} \text{flip}(a, c) \ \& \ \text{flip}(b, d) & \text{if 2-flippable} \\ \emptyset & \text{otherwise} \end{cases}$$

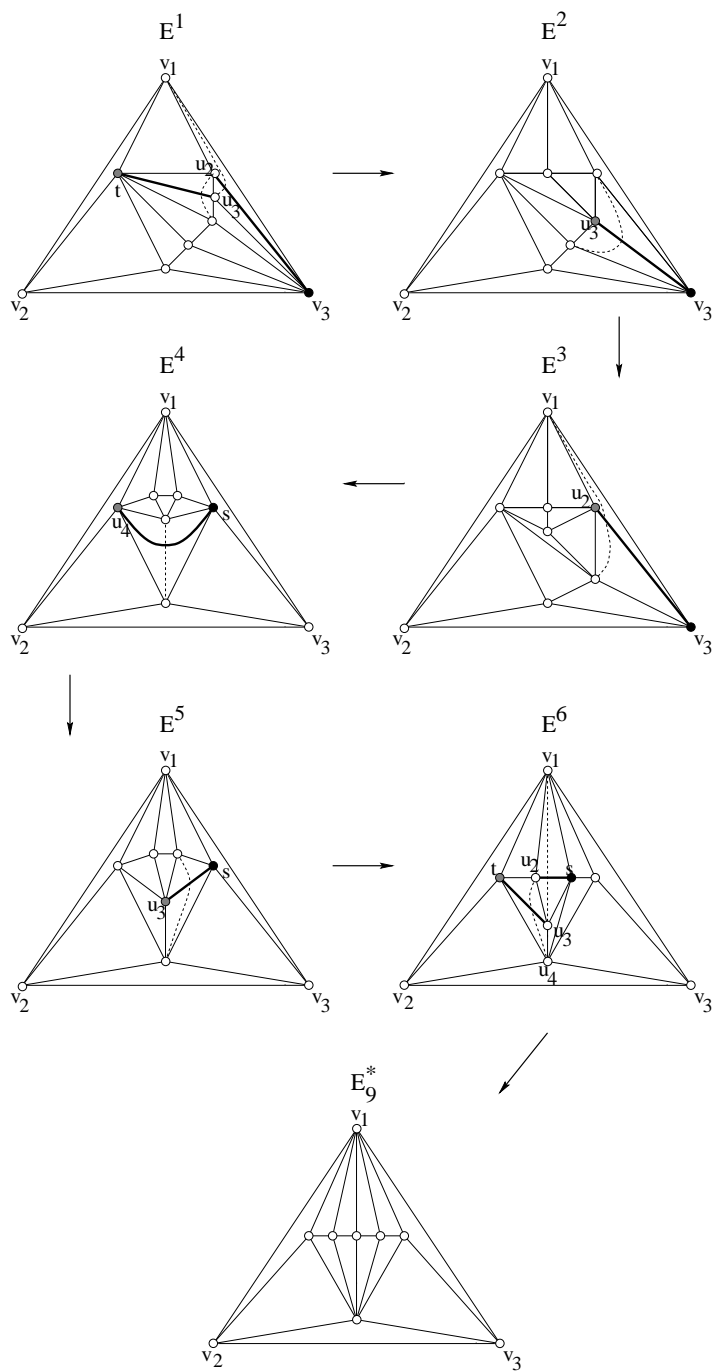
$$\text{Adj}_3(E, j) = \begin{cases} \text{flip}(a, d) \ \& \ \text{flip}(b, c) & \text{if 2-flippable} \\ \emptyset & \text{otherwise} \end{cases}$$

Adjacency Lemma:

The graph defined by $\text{Adj}_1, \text{Adj}_2, \text{Adj}_3$ is connected.

Local Search Function (dotted edge: added; bold edge: deleted)





Local Search Lemma

- Edges returned by `LocalSearch` are either 1-flippable or 2-flippable.
- Successive application of `LocalSearch` transforms any rooted MPG_4 to the target E^* .

