

# The traveling salesman problem with few inner points

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Michael Hoffmann & Yoshio Okamoto\*

ETH Zurich

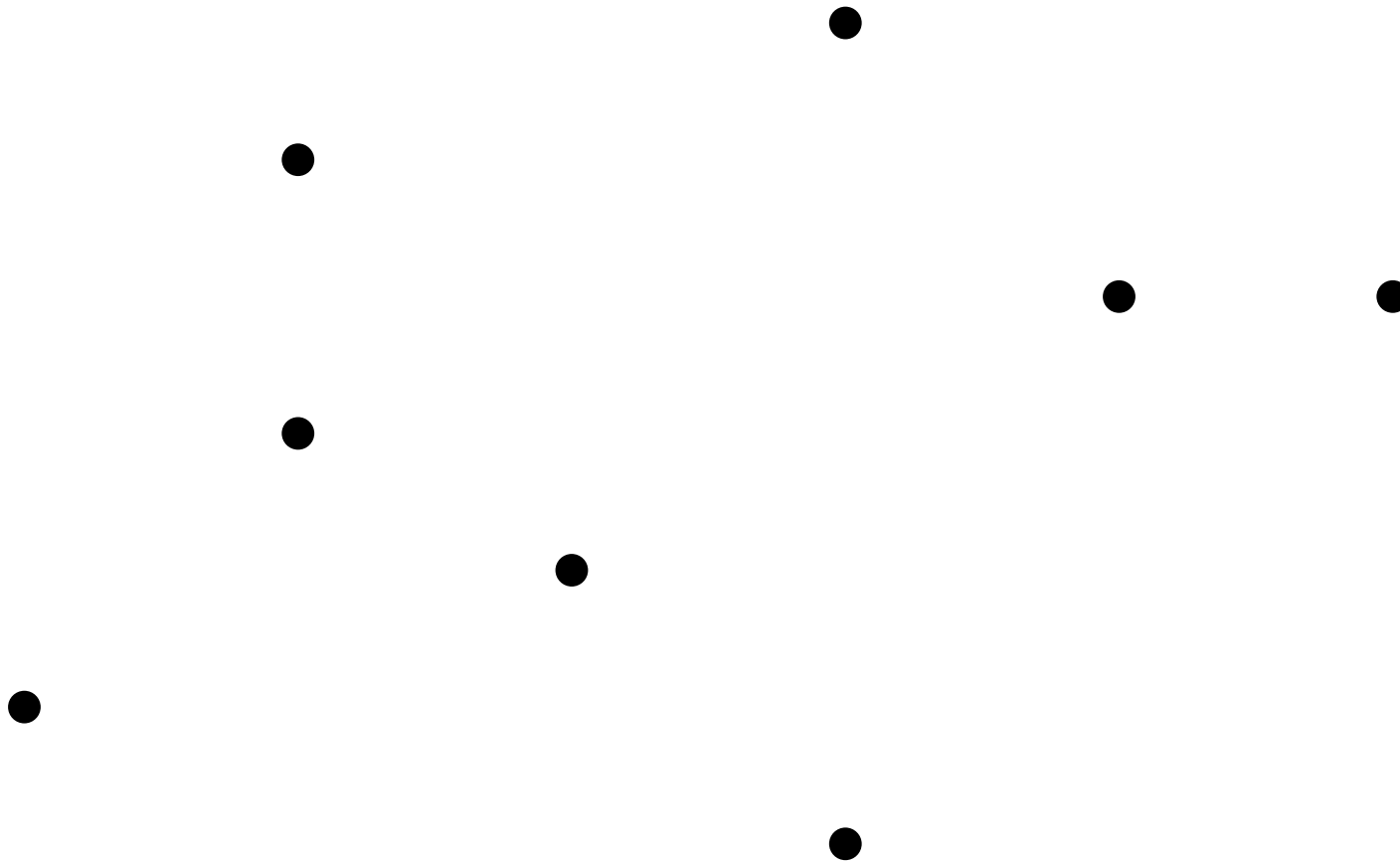
URAW 2004

\* Supported by the Berlin-Zürich Joint Graduate Program





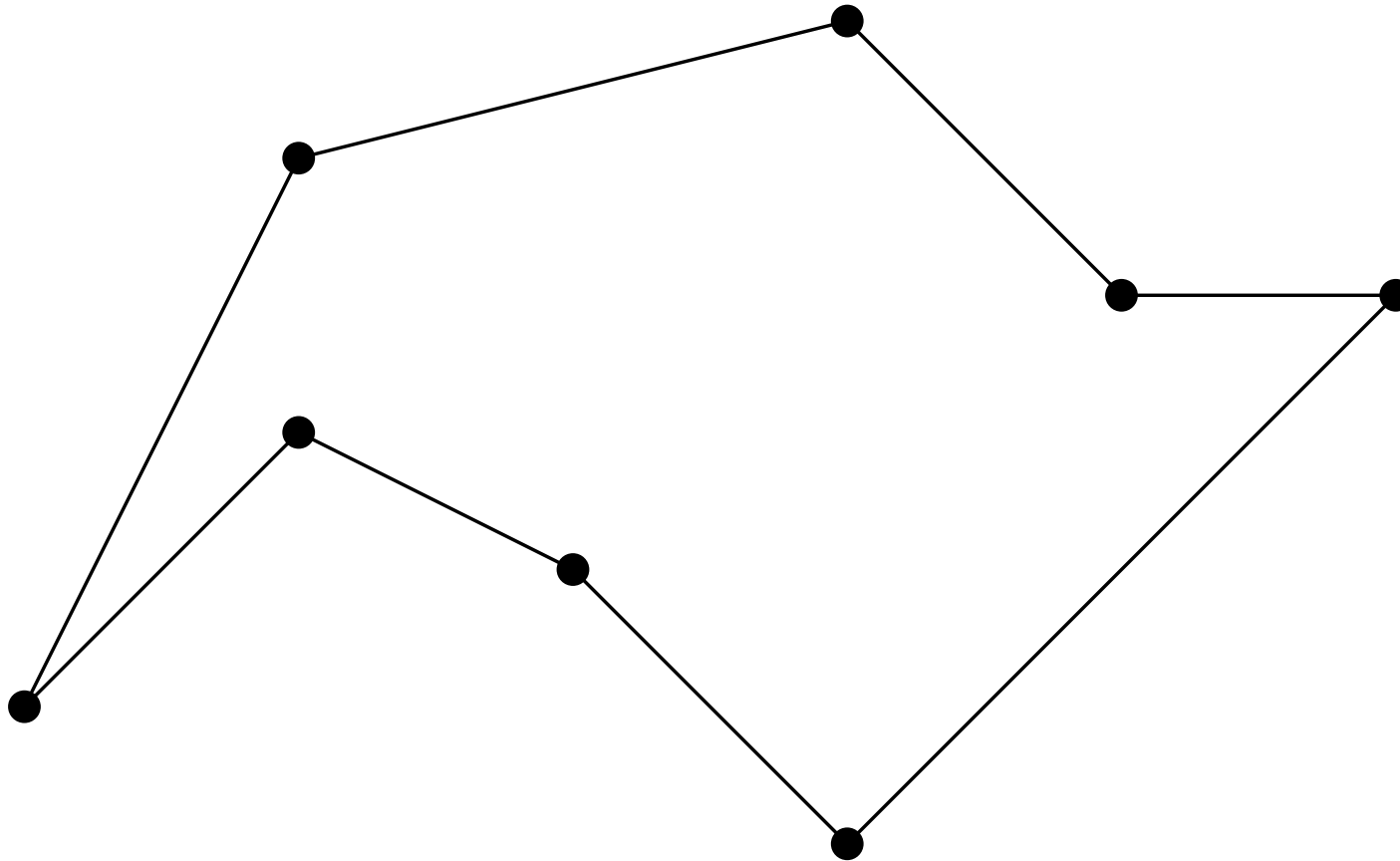
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Find: a minimum-length tour





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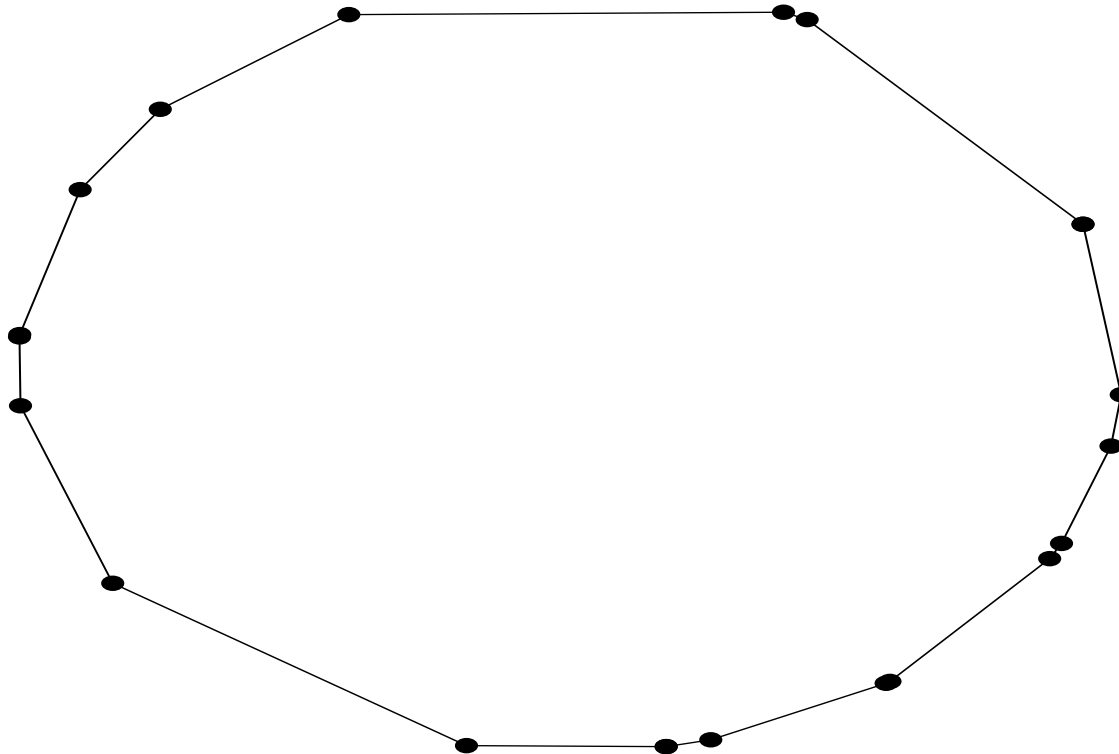


- ◆ In general, it is NP-hard.

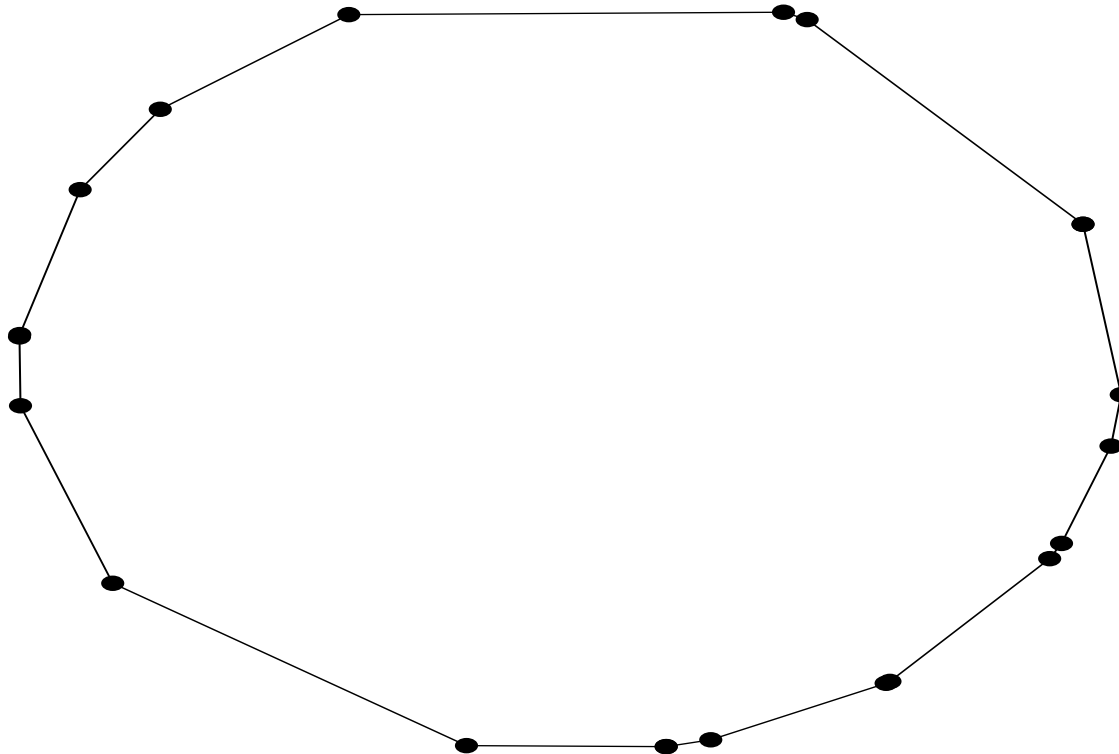
(Garey, Graham & Johnson '76

Papadimitriou '77)

- ◆ When the points are in convex position, the problem is easy.

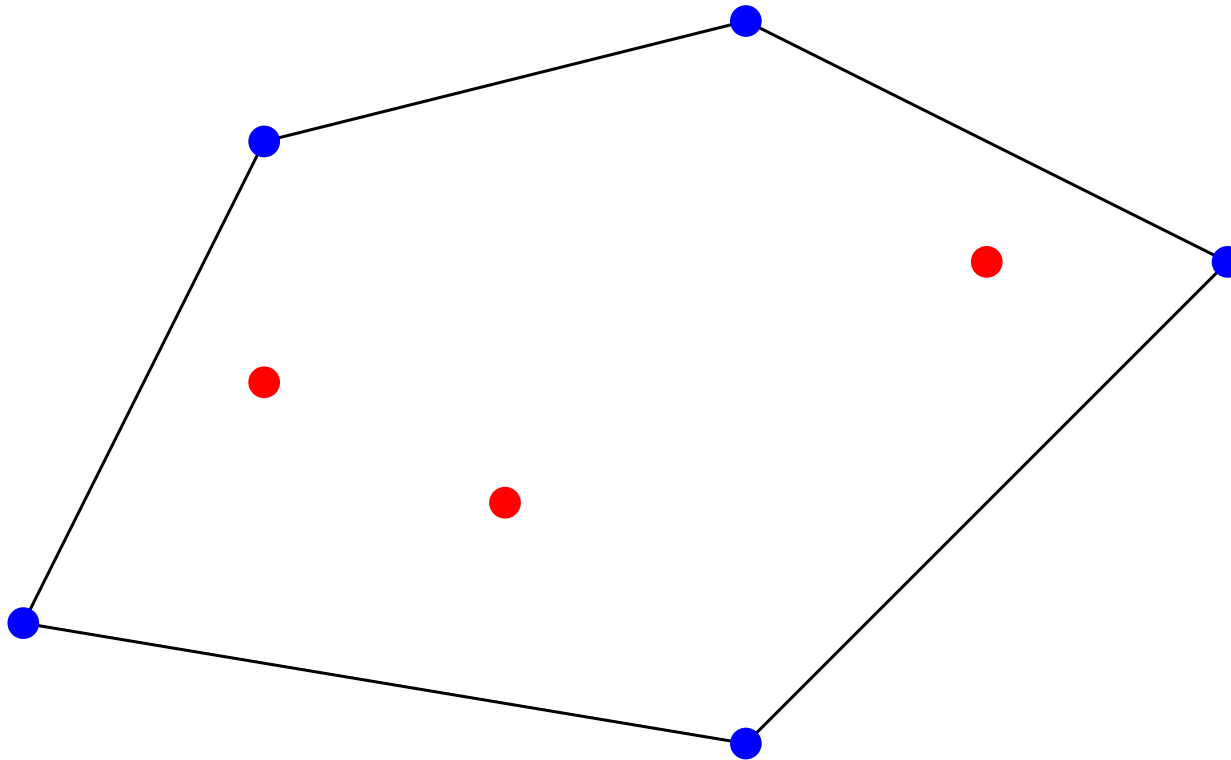


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## Observation

The **inner points** make the problem difficult.



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## Motivation

**How many inner points can we have in order to obtain a polynomial-time algorithm?**

**Result**

**We give two simple algorithms.**

$n$  := the total number of points

$k$  := the number of inner points

- ◆ First algorithm runs in polynomial time when  $k = O(1)$ .
- ◆ Second algorithm runs in polynomial time when  $k = O(\log n / \log \log n)$ .

Open problem: Improve the bound!



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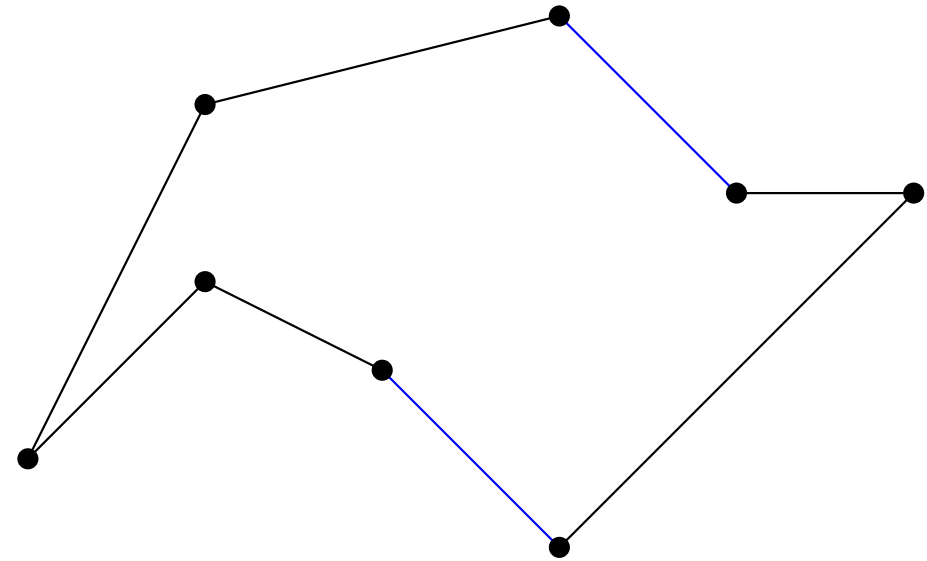
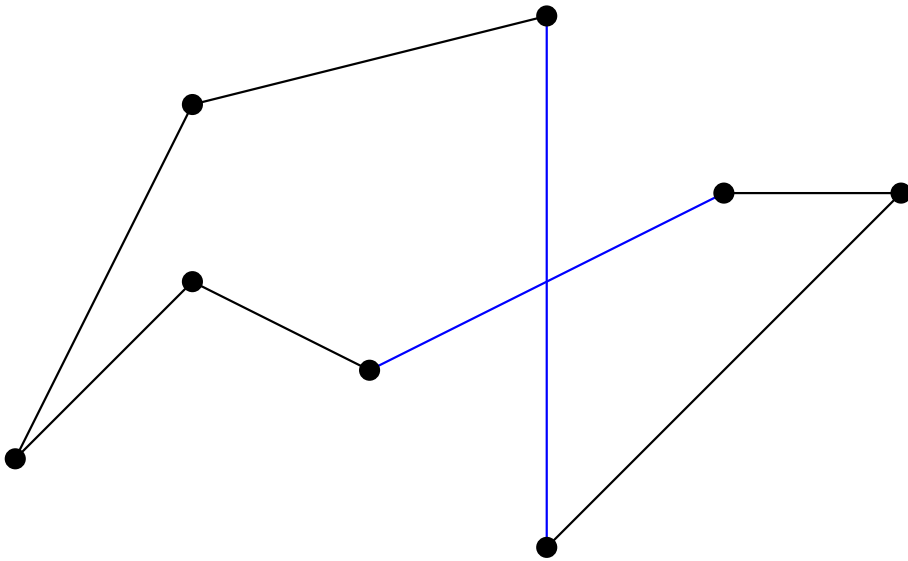
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**Fact**

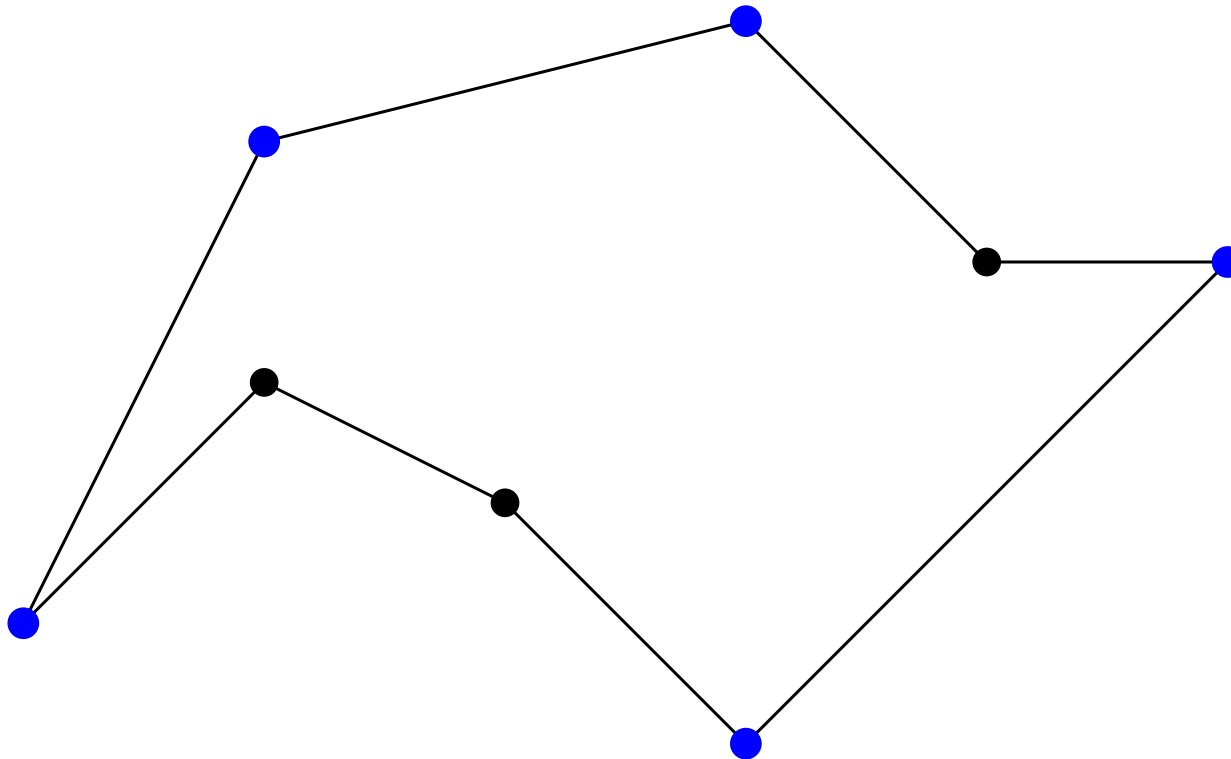
(Flood '56)

An optimal tour has no self-crossing.

**Proof**

**Corollary**

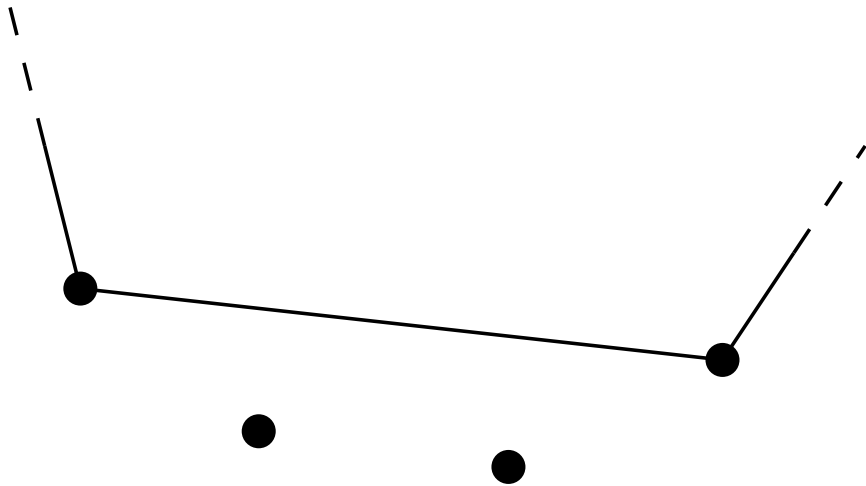
An optimal tour visits the non-inner points in a cyclic order.



## Corollary

An optimal tour visits the non-inner points in a cyclic order.

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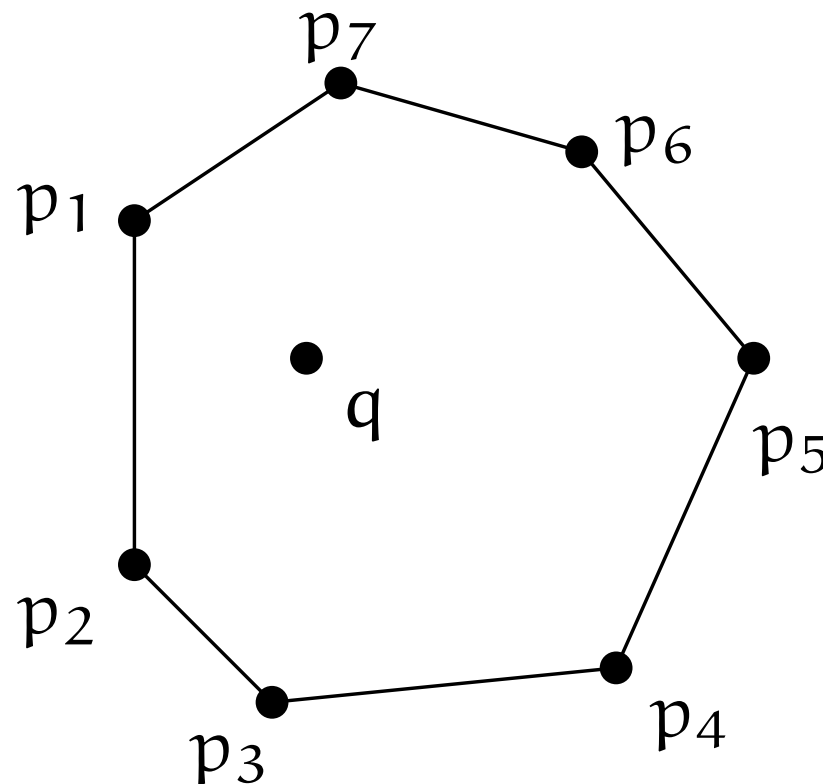
Suppose not.  
Then  $\exists$  a "skip."  
Skipped points must  
be visited later,  
which causes a self-  
crossing.  
A contradiction.

Consider the case  $k = 1$ . ( $k := \#$  of inner pts)

Inner point:  $q$

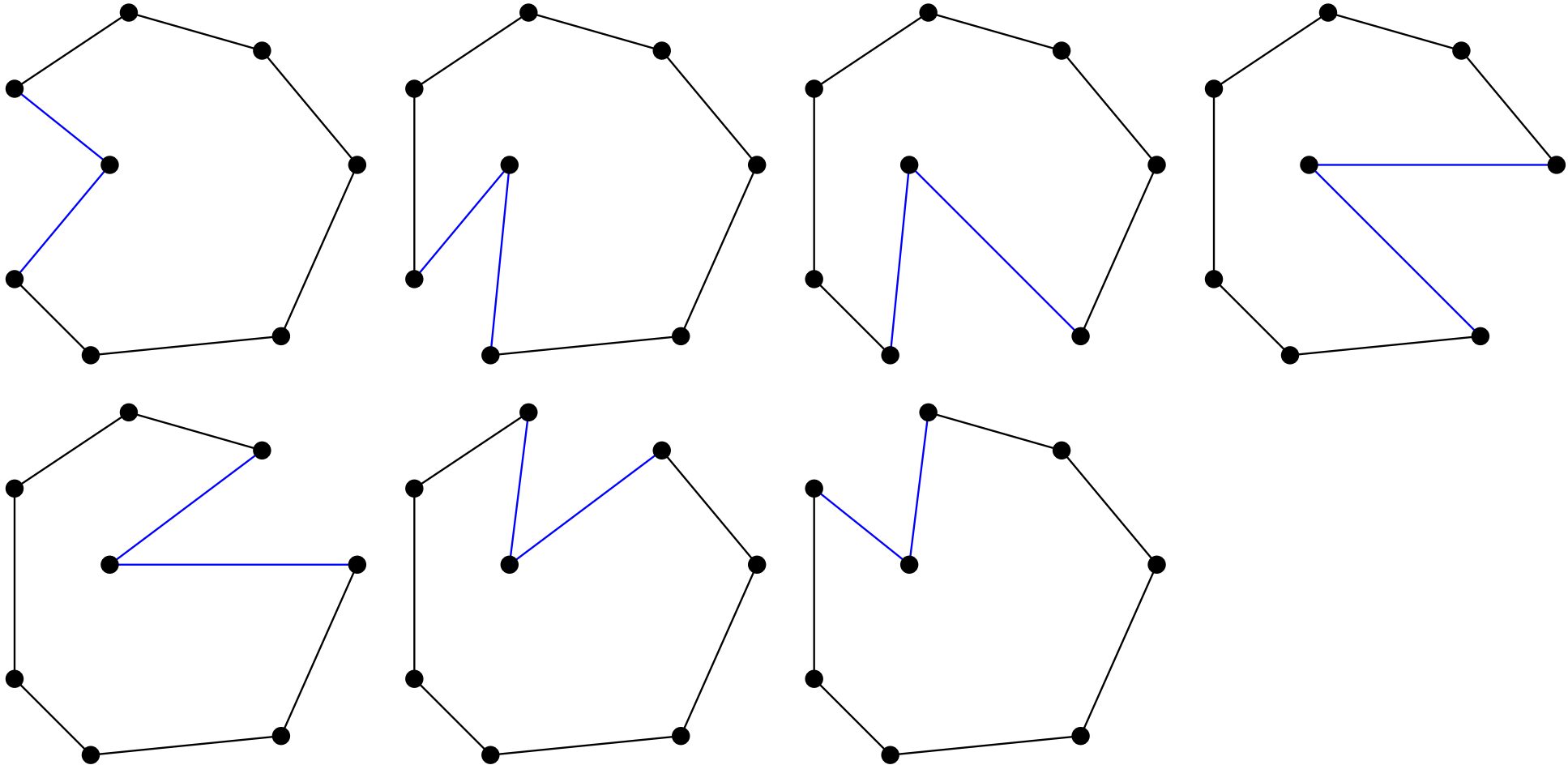
Non-inner points:  $p_1, p_2, \dots, p_{n-1}$

labeled according to a cyclic order





# of tours which “respect” the cycl. order =  $n-1$ .



**Choose the best one.**

- (1) Distinguish the inner points and the non-inner points;
- (2) Fix a cyclic order on the non-inner points;
- (3) For each tour which respects the cyclic order
  - (i) Compute the length of the tour;
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There are  $k$  inner points.

- ◆ # of tours which “respect” the cycl. order  
=  $O(k!n^k)$ .
- ◆ They can be enumerated in  $O(1)$  time per tour.
- ◆ The length of each tour can be computed in  $O(n)$  time.

The running time =  $\underbrace{O(n \log n)}_{\text{convex hull computation}} + O(k!n^{k+1})$ .

When  $k$  is a constant, this is polynomial in  $n$ .



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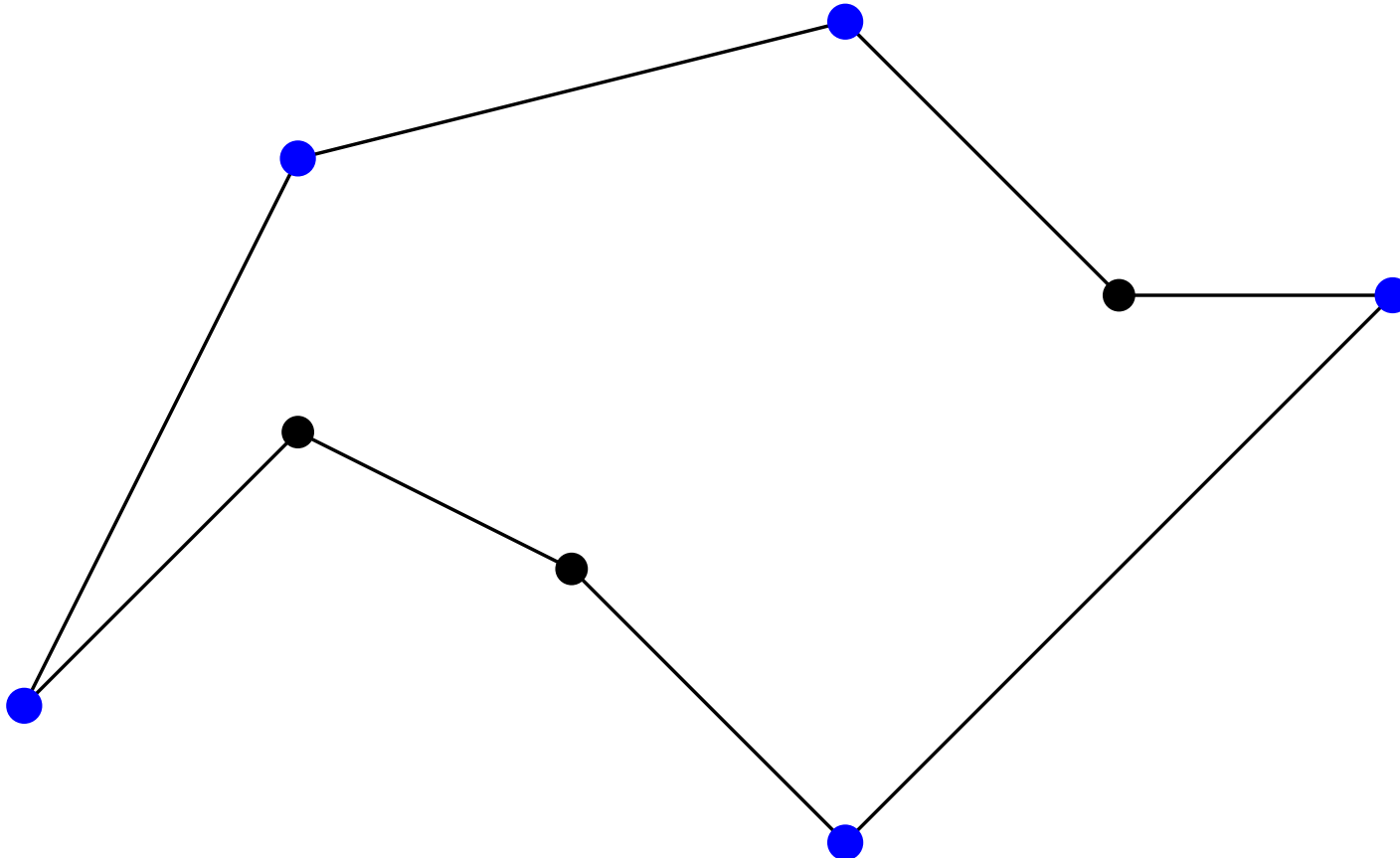
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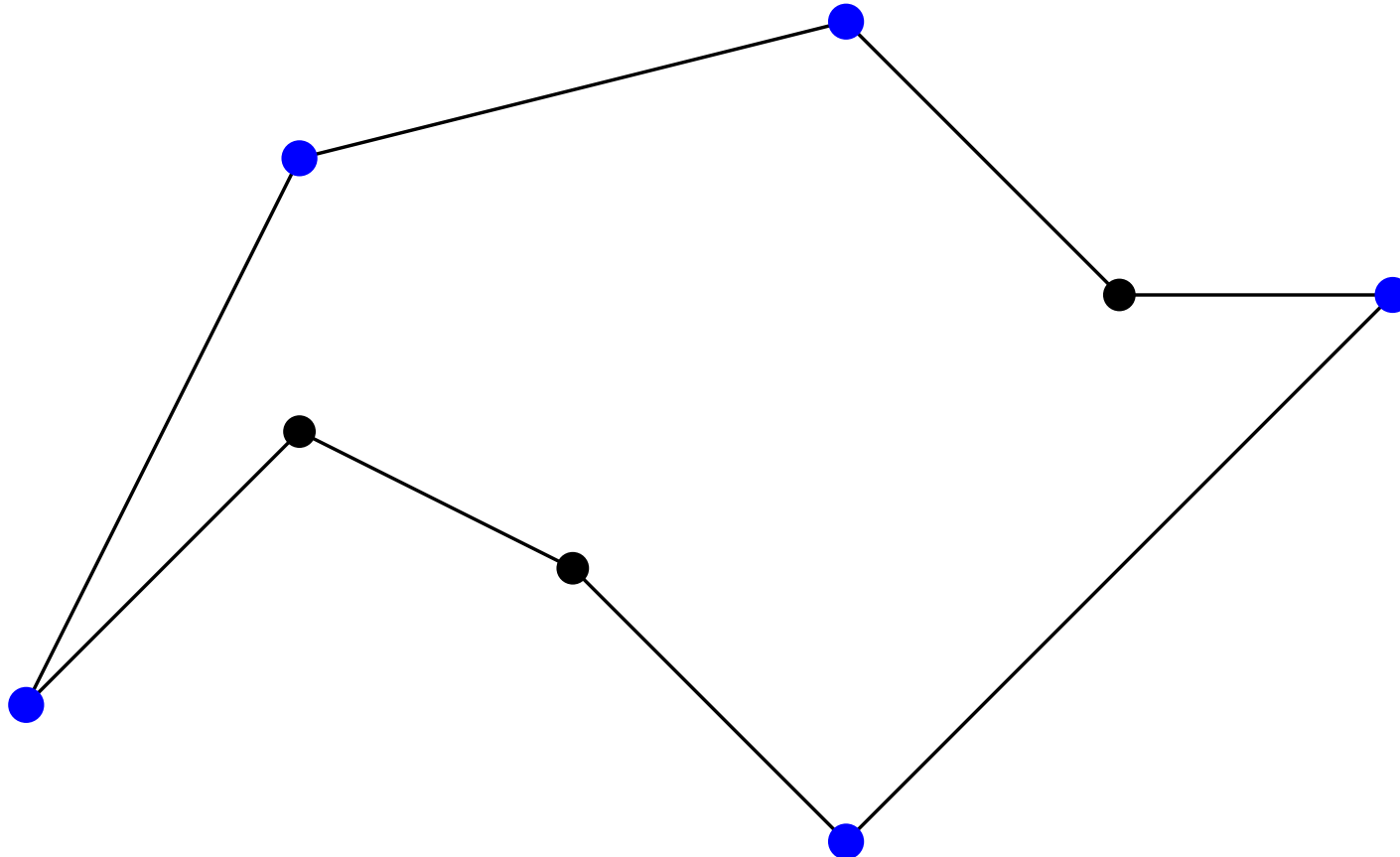
**Fact** we already saw

An optimal tour respects  
a cyclic order on the non-inner points.



**Another fact**

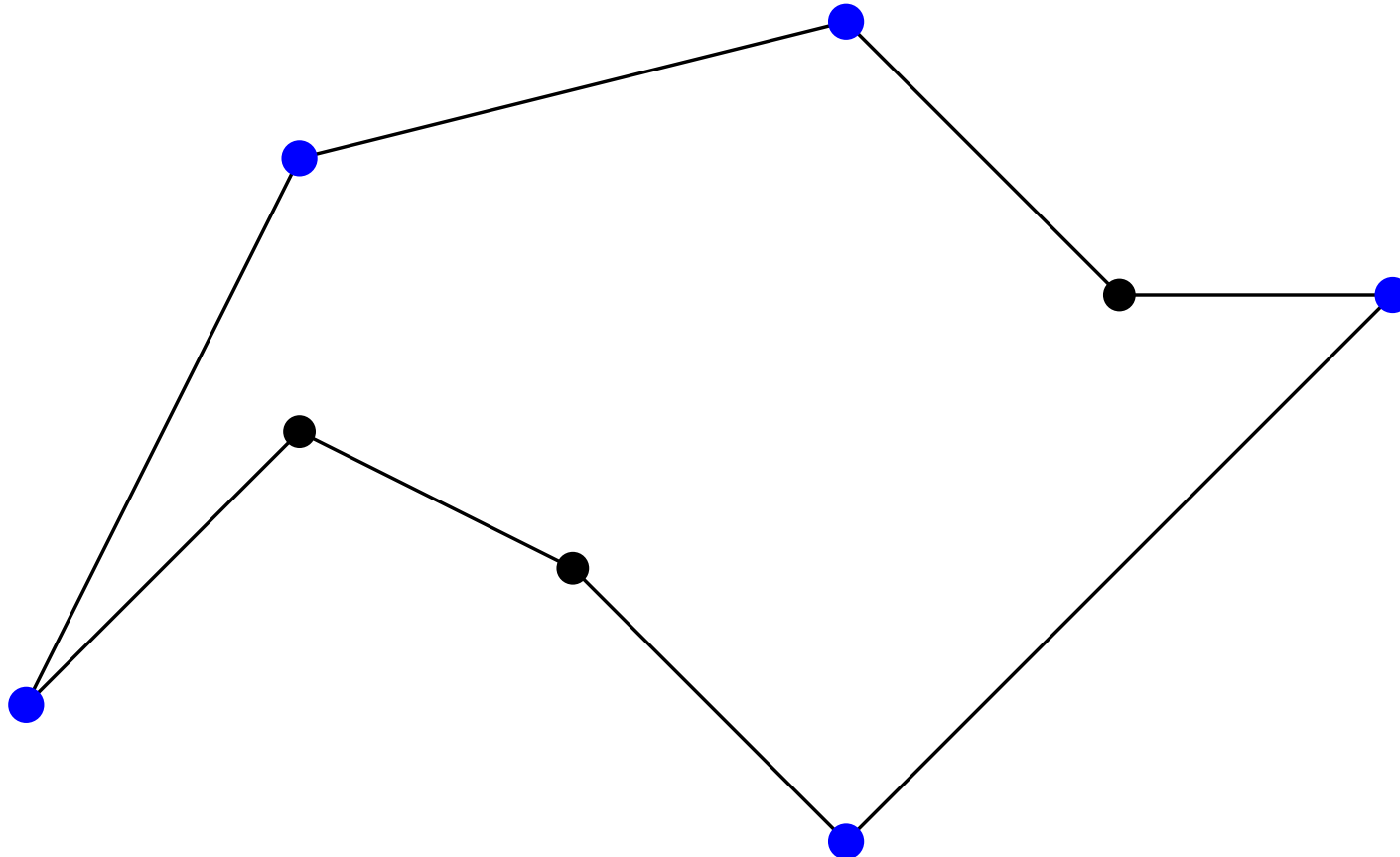
An optimal tour respects some linear order on the inner points.





## Idea

Try all linear orders on the inner points.



- (1) Distinguish the inner points and the non-inner points;
- (2) Fix a cyclic order on the non-inner points;
- (3) For each linear order on the inner points
  - (i) Compute an optimal tour among those which respect these two orders;
- (4) Choose the best one among them.

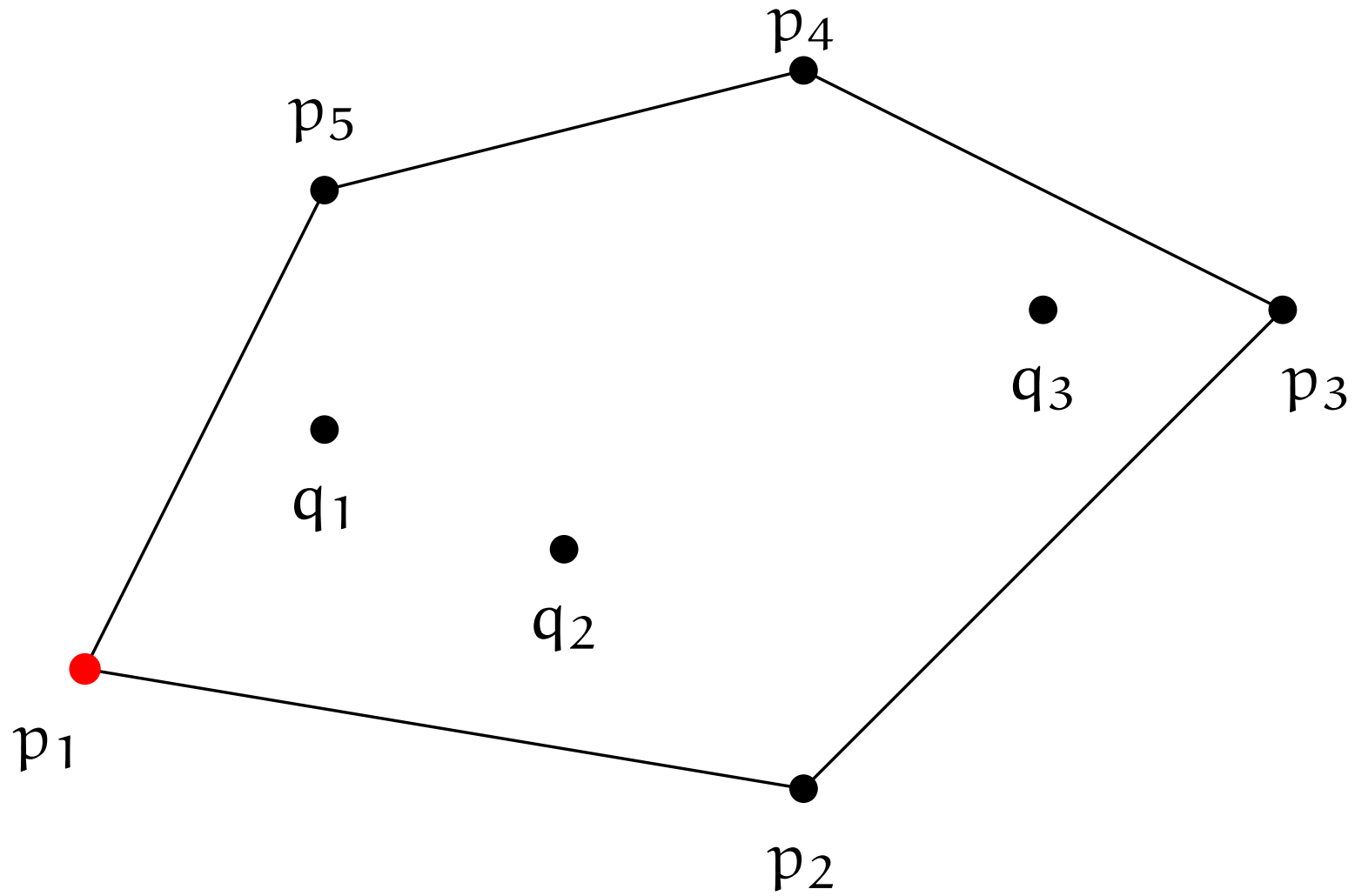
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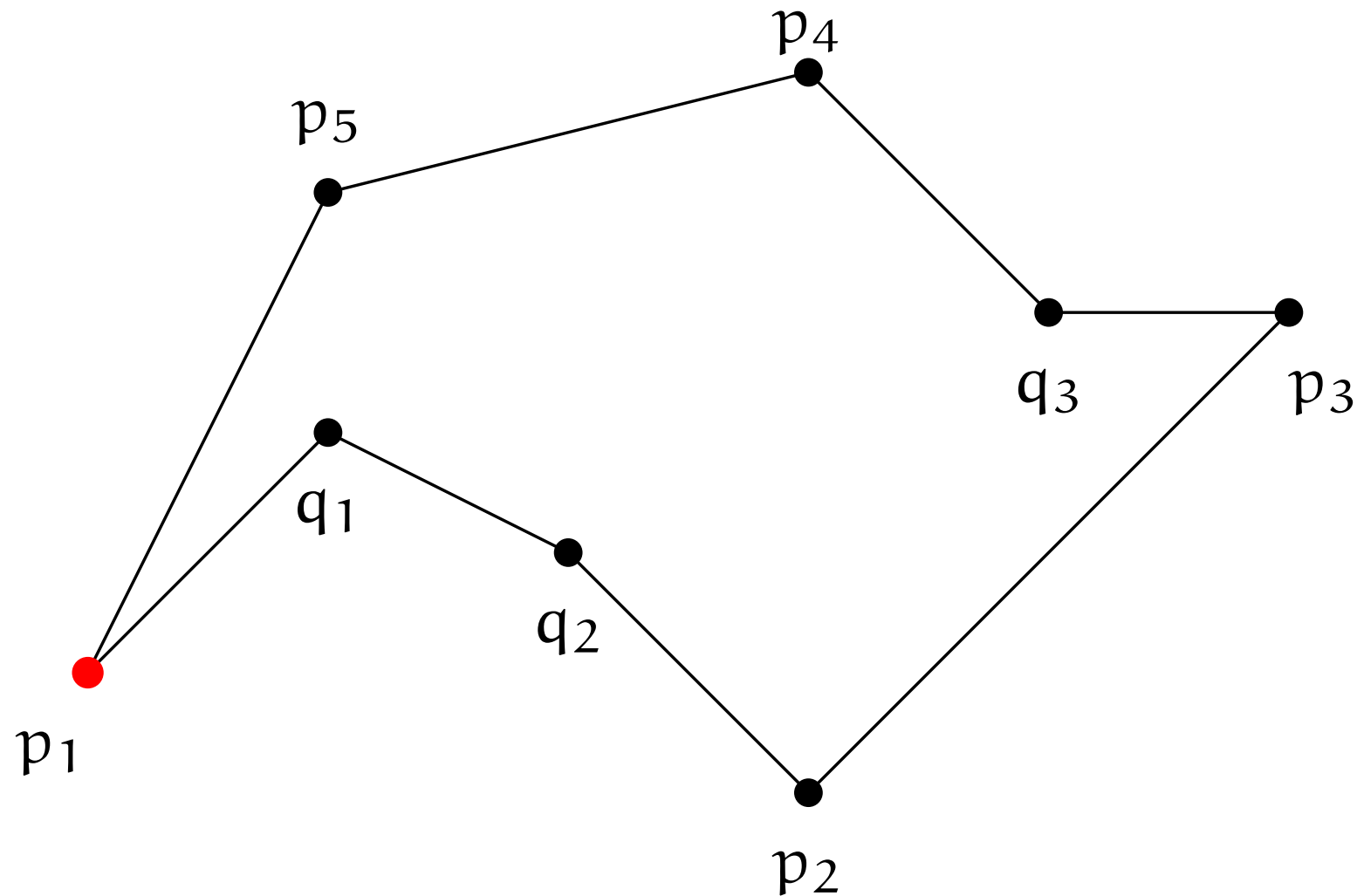
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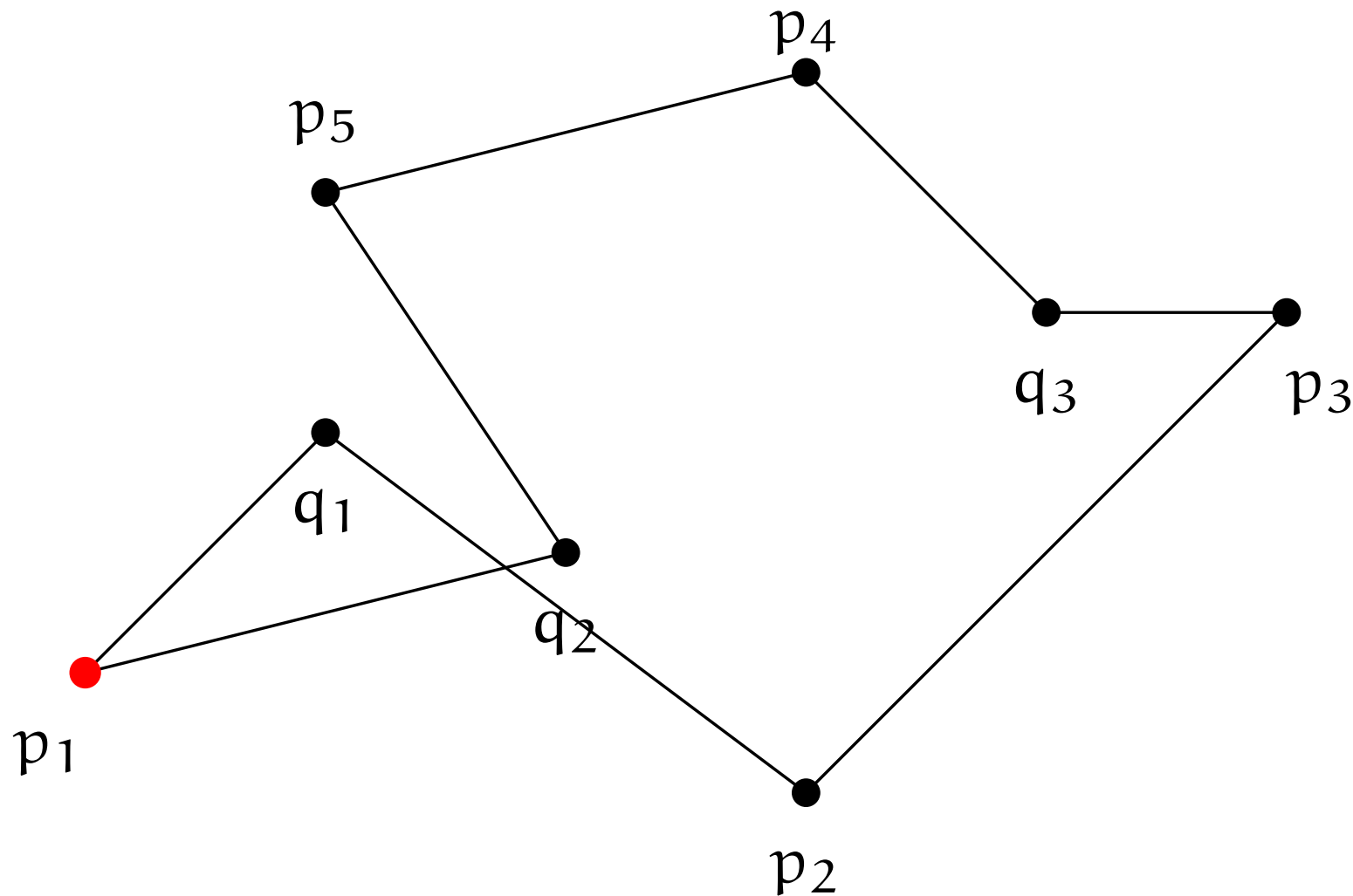
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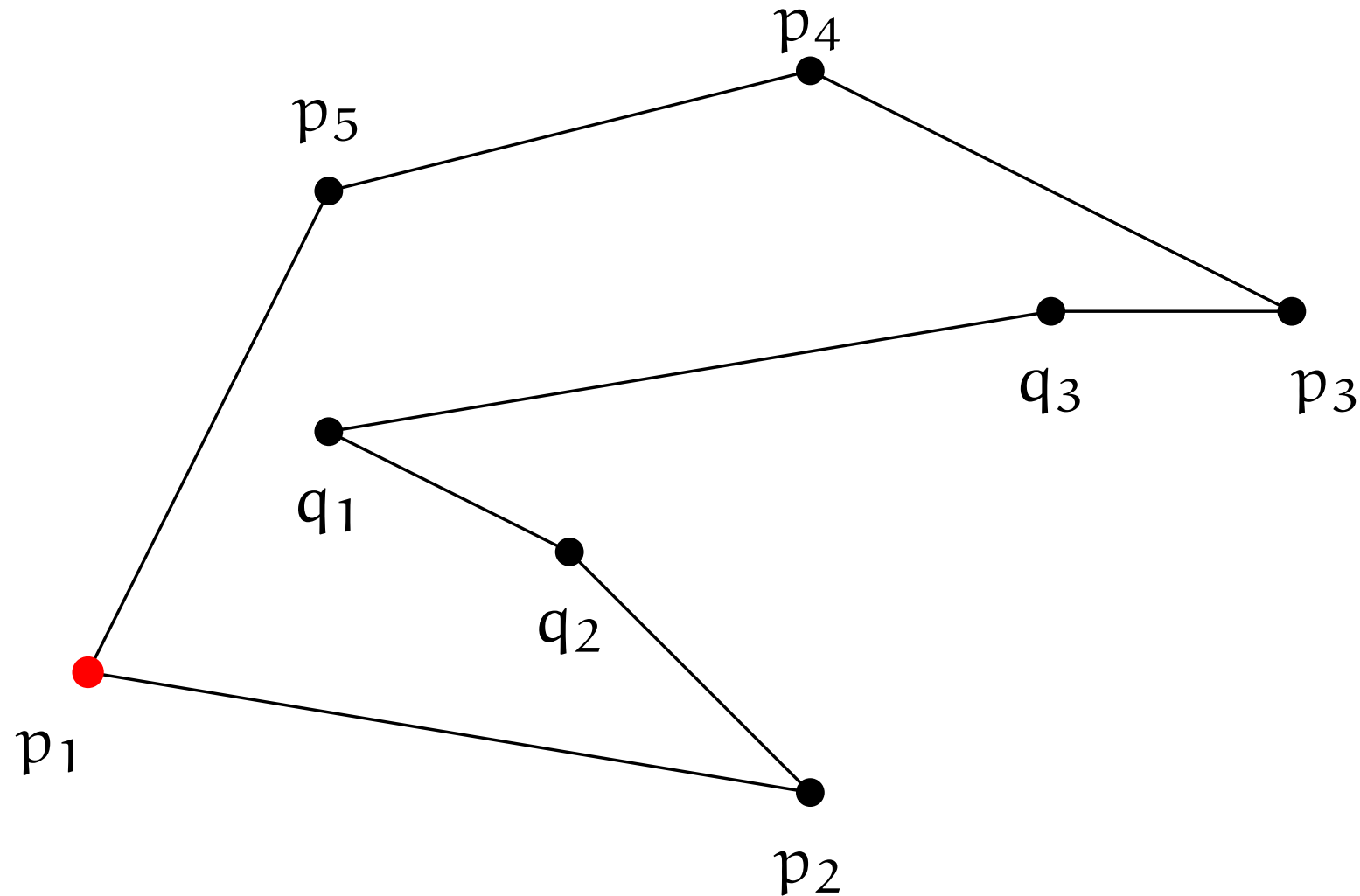




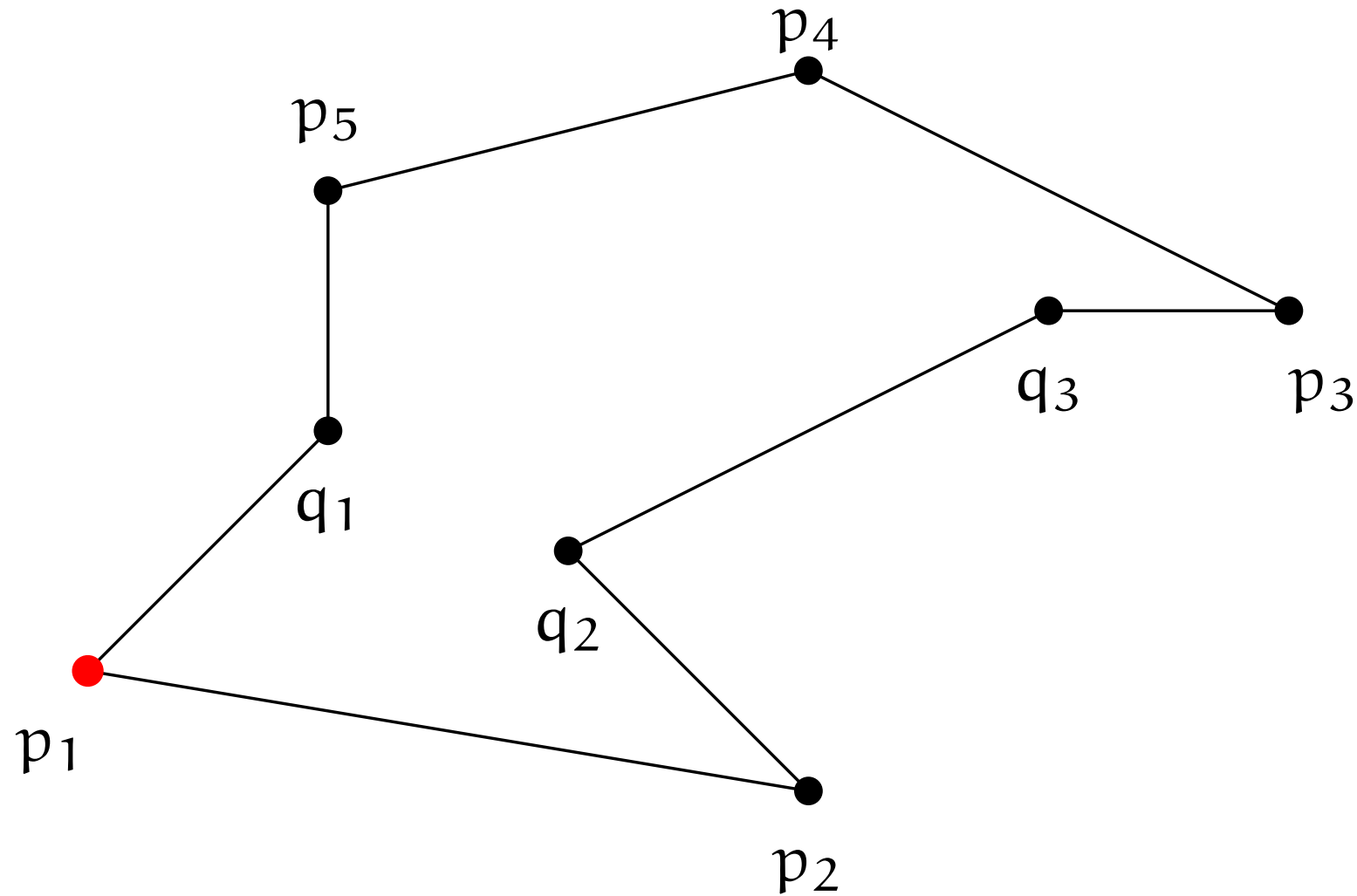
Optimal tour among those which respect the cyclic order and the order “1–2–3.”



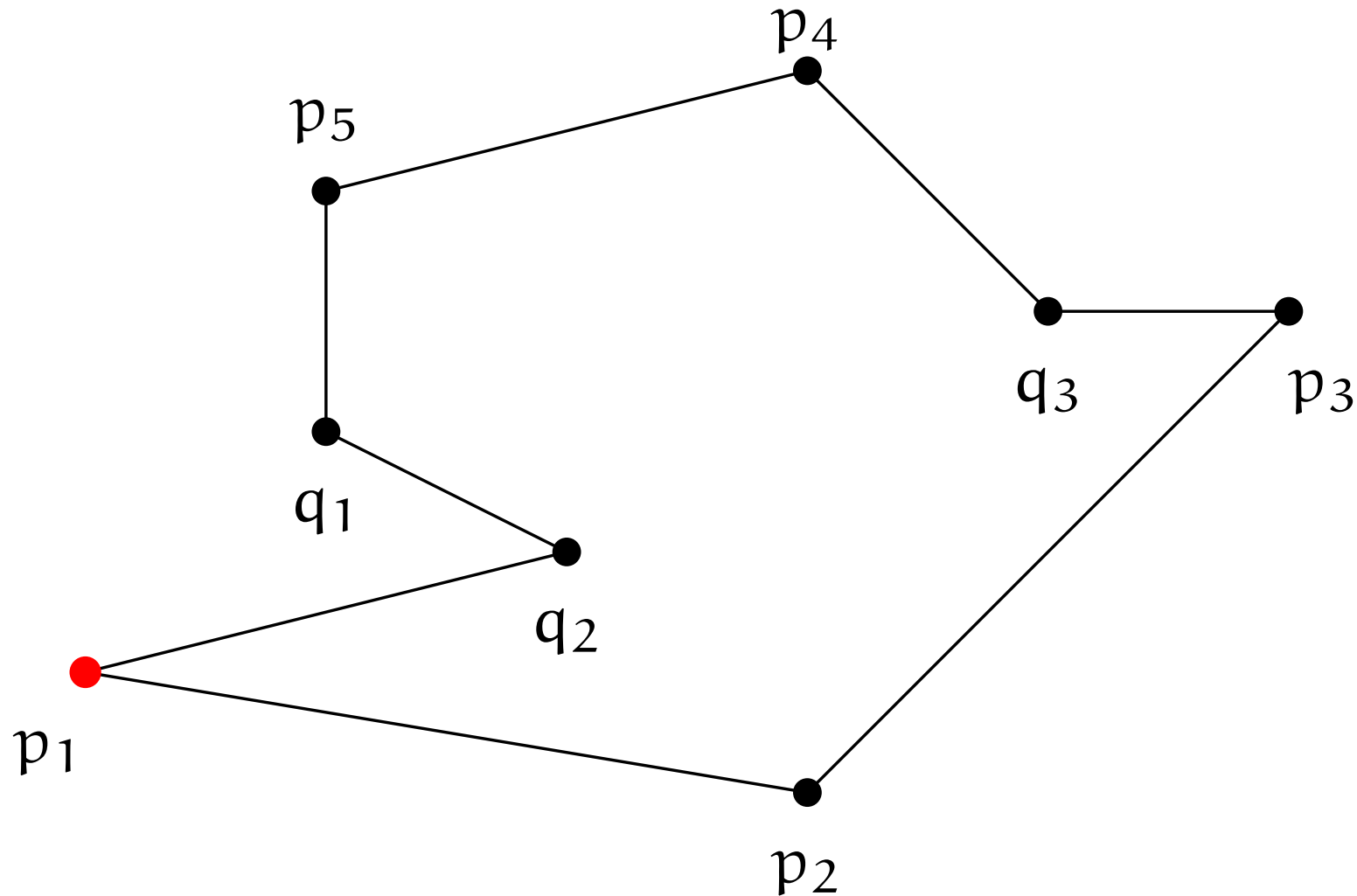
Optimal tour among those which respect the cyclic order and the order “1-3-2.”



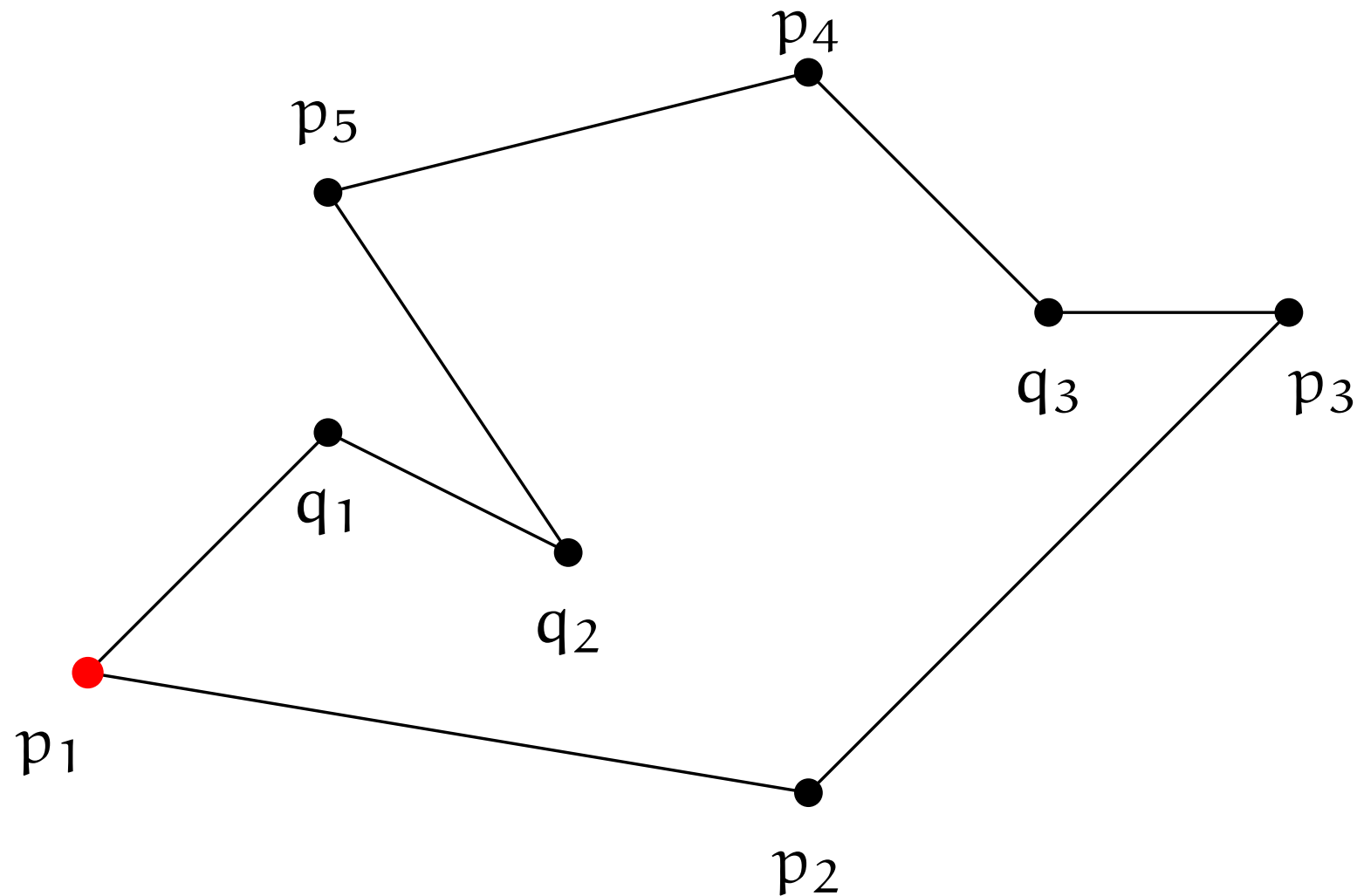
Optimal tour among those which respect the cyclic order and the order “2–1–3.”



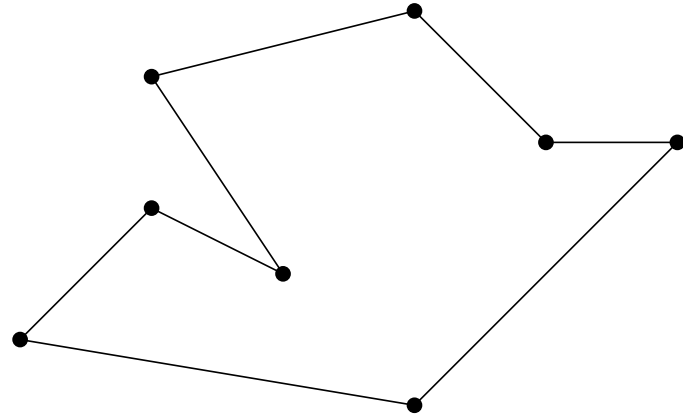
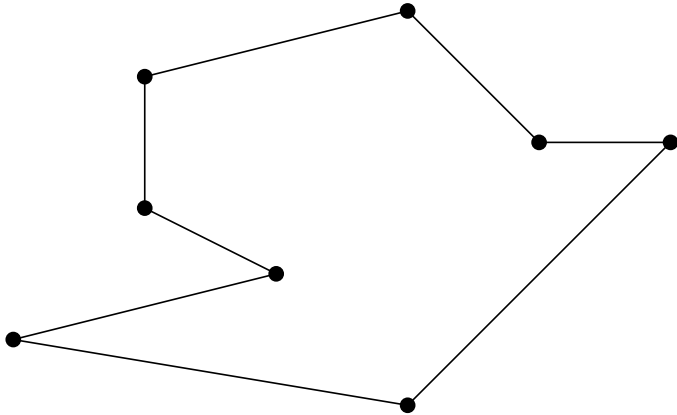
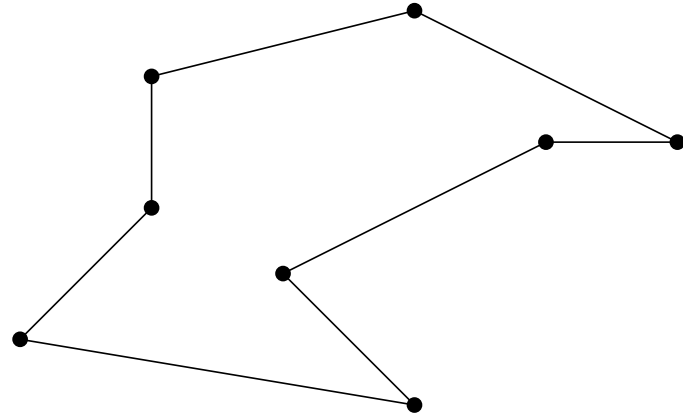
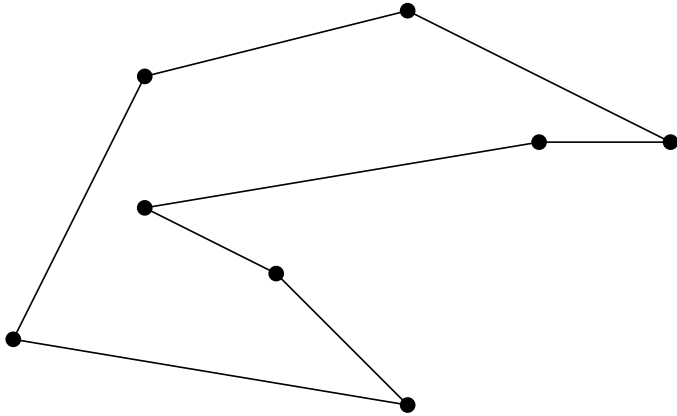
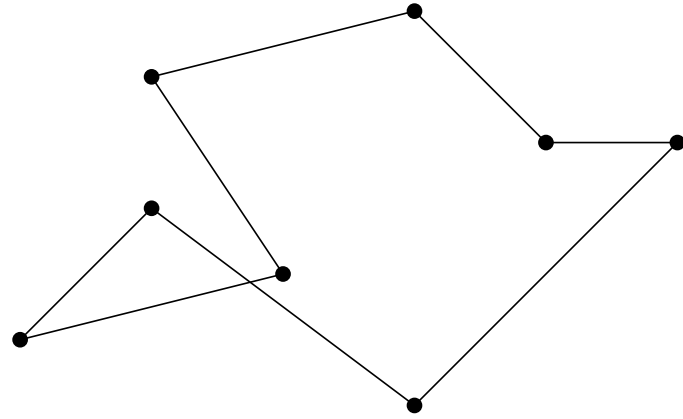
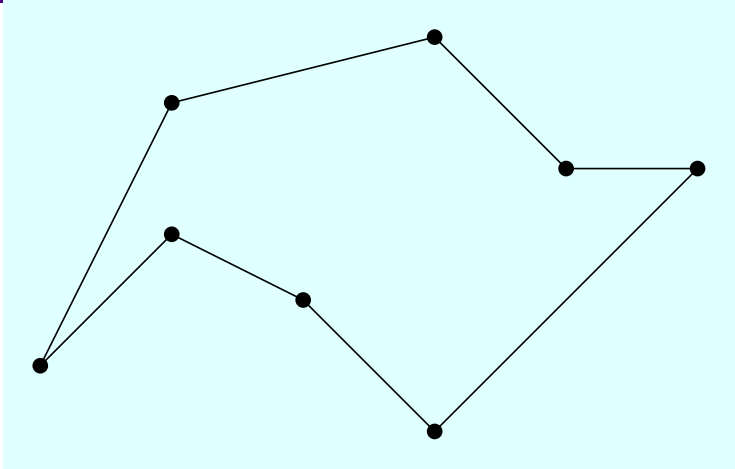
Optimal tour among those which respect the cyclic order and the order “2–3–1.”



Optimal tour among those which respect the cyclic order and the order “3-1-2.”



Optimal tour among those which respect the cyclic order and the order “3–2–1.”



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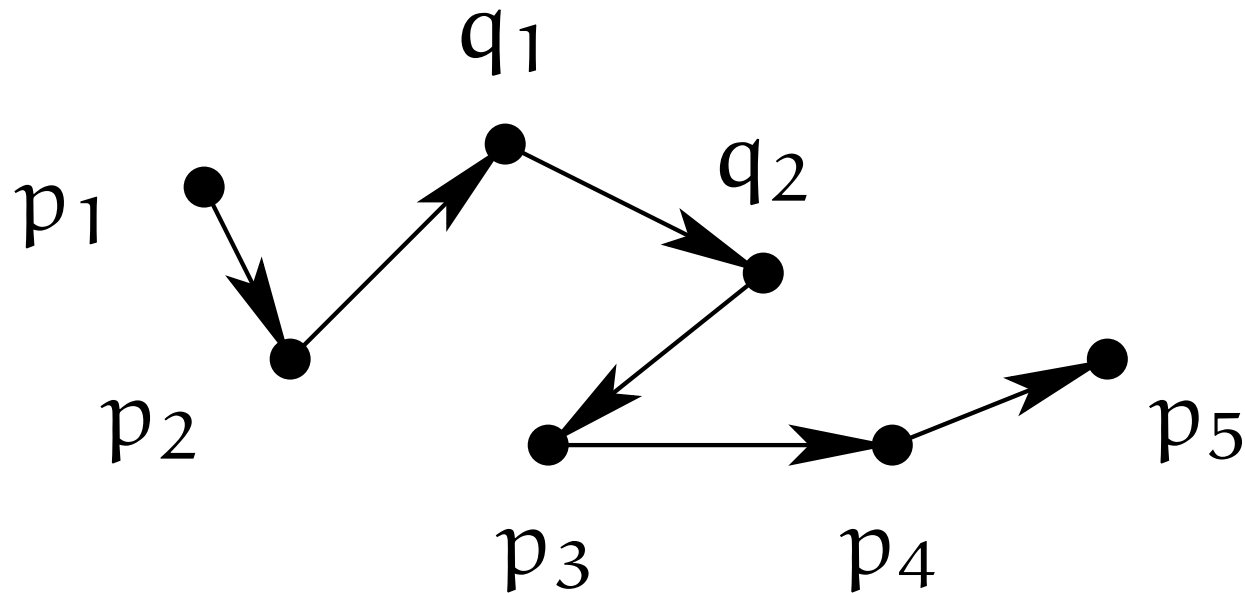
Not yet clear: How to do Step (3i)??



$p_1, \dots, p_{n-k}$  a cycl. order on the non-inner pts

$q_1, \dots, q_k$  a linear order on the inner pts

$F(\underline{i}, j) :=$  the length of a shortest path  
from  $p_1$  to  $p_i$   
via  $p_1, \dots, p_i$  and  $q_1, \dots, q_j$   
which respects these two orders

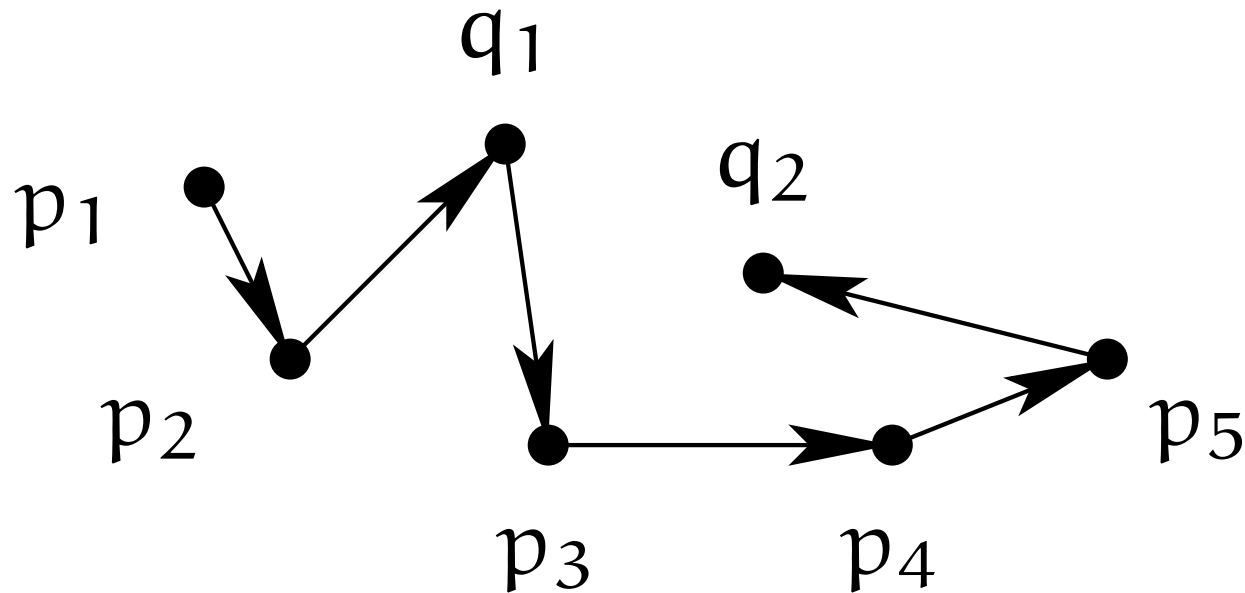


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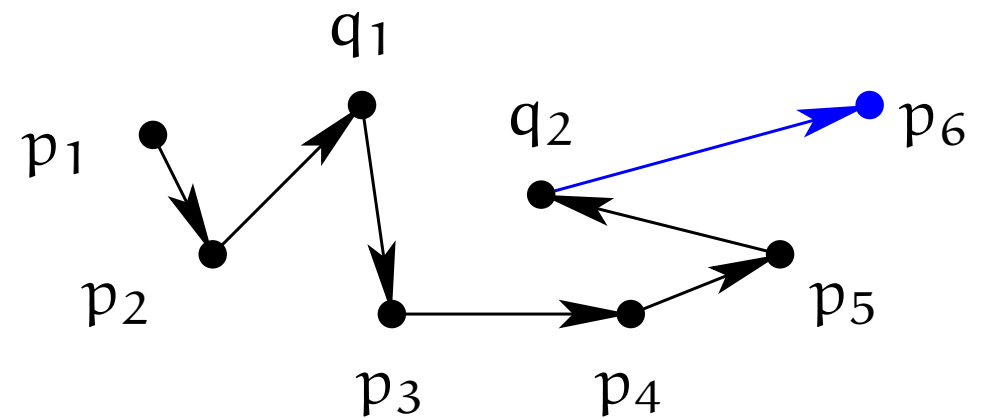
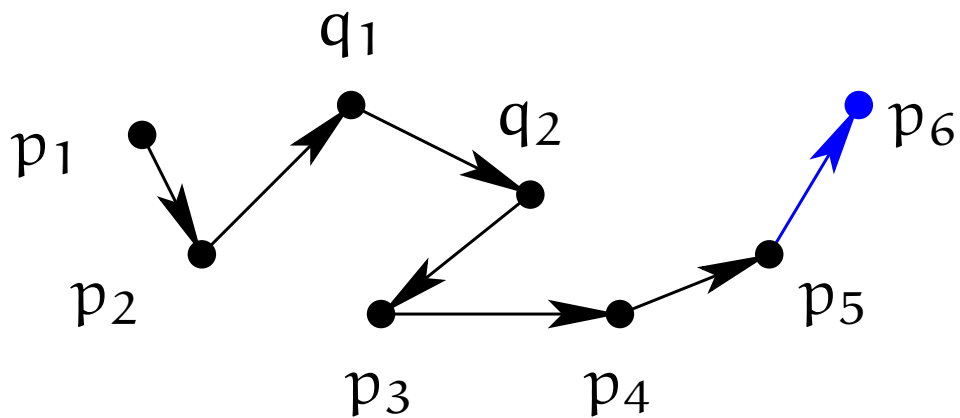
$F(i, j) :=$  the length of a shortest path  
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$(i = 5, j = 2)$

It holds that

$$F(\underline{i+1}, j) = \text{minimum of} \\ F(\underline{i}, j) + d(p_i, p_{i+1}) \text{ and} \\ F(i, \underline{j}) + d(q_j, p_{i+1}).$$



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- ◆ By the dynamic programming technique,  $F(\underline{n-k}, k)$  and  $F(n-k, \underline{k})$  can be computed in  $O(kn)$  time.
- ◆ The length of a shortest tour which respects these two orders is the minimum of  $F(\underline{n-k}, k) + d(p_{n-k}, p_1)$  and  $F(n-k, \underline{k}) + d(q_k, p_1)$ .

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What remains: the analysis of the running time

There are  $k$  inner points.

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The running time =  $\underbrace{O(n \log n)}_{\text{convex hull computation}} + O(k!kn)$ .

When  $k = O(\log n / \log \log n)$ , this is poly. in  $n$ .



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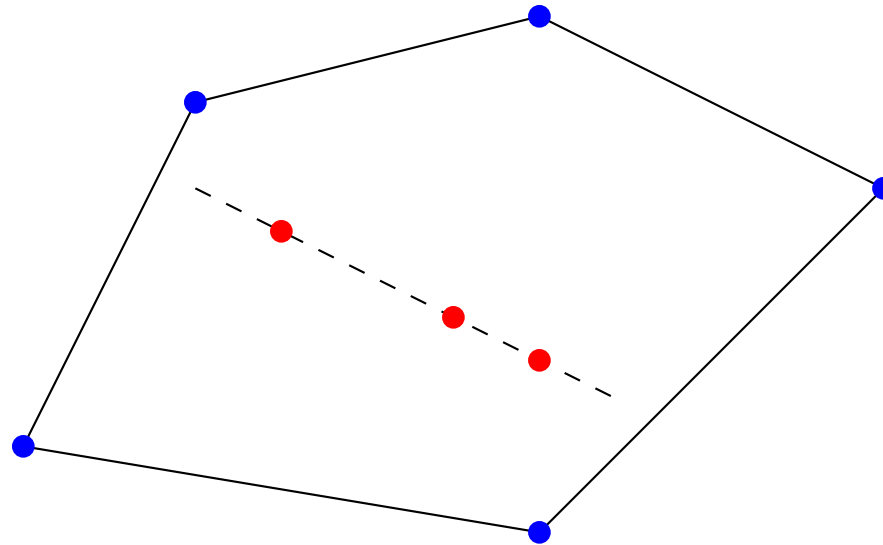
- ◆ First algorithm runs in  $O(k!n^{k+1})$  time which is poly. when  $k = O(1)$ .
- ◆ Second algorithm runs in  $O(k!kn)$  time which is poly. when  $k = O(\log n / \log \log n)$ .

Open problem: Improve the bound!

**Thm**

(Deĭneko, van Dal &amp; Rote '96)

2DTSP can be solved in  $O(kn)$  time  
when the inner points lie on a line.



Our work { deals with the most general case.  
still runs in linear time in  $n$ .

The same strategy works for other problems.

- ◆ The prize-collecting TSP
- ◆ The partial TSP

## Result

The 2D versions of these problems with  $k$  inner points can be solved in polynomial time when  $k = O(\log n / \log \log n)$ .