

# Fixed-Parameter Algorithms for Covering Points with Lines

---

Apichat Heednacram  
PhD Student

Supervisors: Prof. Vladimir Estivill-Castro  
Dr. Francis Suraweera

Institute for Integrated & Intelligent Systems (IIIS),  
Griffith University, Brisbane, Australia

# Outline

---

- Research motivation
- Research aims
- The LINE COVER problem
- Other hard geometric problems and their progress

# Research Motivation

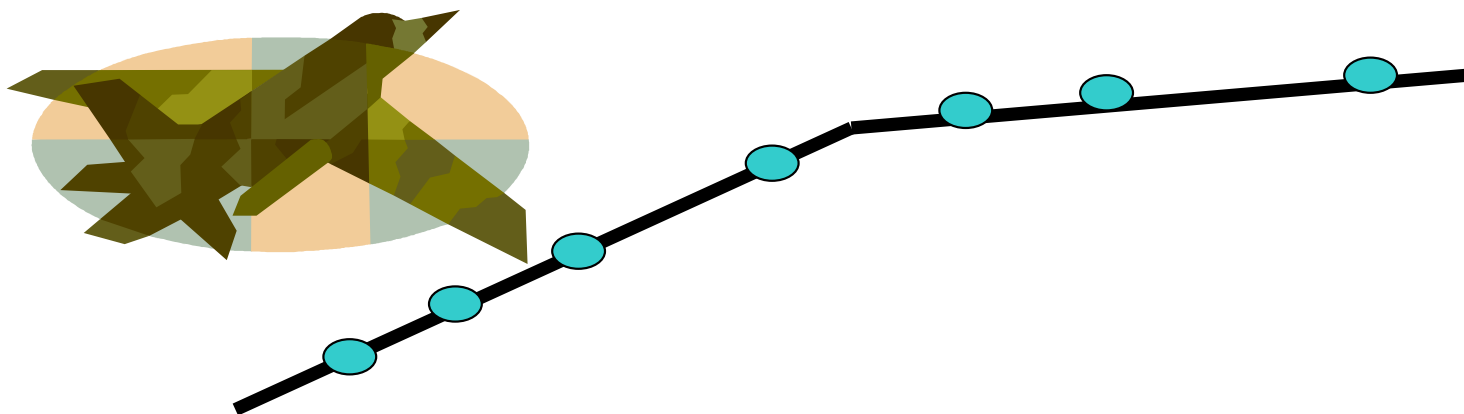
---

- The survey of Giannopoulos et al. (2008) shows that there are only **a few FPT results** in computational geometry.
- Vankatesh Raman reports in "Parameterized Complexity Newsletter" (Sept, 2009) that there seems to be **little research** on parameterized techniques for geometric problems.

# Research Aims

---

1. Solve some hard geometric problems (e.g. the LINE COVER problem, the Minimum Bends TSP, etc.).
2. Design algorithms using FPT approach.

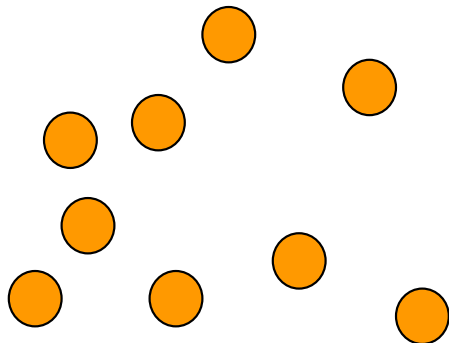


# The LINE COVER Problem

---

**Instance:** A set  $S$  of  $n$  points, a positive integer  $k$   
**Parameter:**  $k$   
**Question:** Is it possible to cover  $n$  points in the plane with at most  $k$  lines?

$$n = 9, k = 3$$

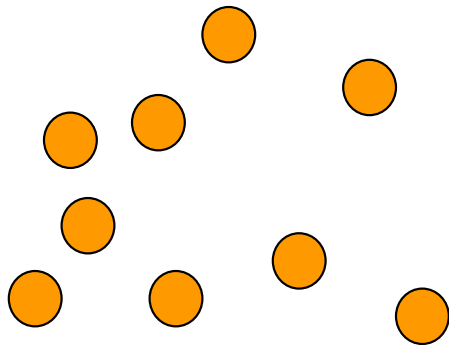


# The LINE COVER Problem

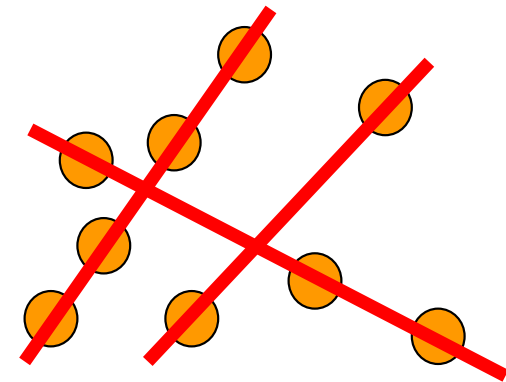
---

**Instance:** A set  $S$  of  $n$  points, a positive integer  $k$   
**Parameter:**  $k$   
**Question:** Is it possible to cover  $n$  points in the plane with at most  $k$  lines?

$n = 9, k = 3$



YES, we can



# History

---

- NP-hard (Megiddo and Tamir, 1982)
- FPT (Langerman and Morin, 2005)
- Improved time complexity  
(Grantson et al., 2006) based on
  - Guibas et al., 1996
  - Langerman and Morin, 2005

# Our contributions

---

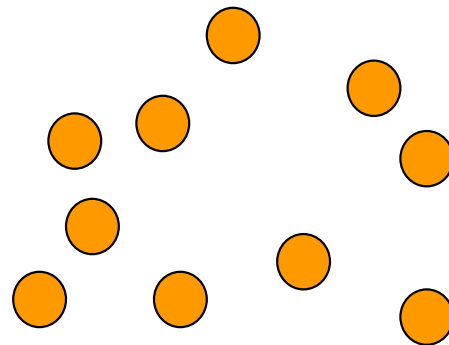
- New reduction rules
- Exact solutions for both the decision and optimization versions
- Experimental results and discussion in comparison with previous algorithms [LM05, GL06]
- Practical FPT algorithms

# Reduction Rule 1

---

- If  $k \geq \lceil n/2 \rceil$ , then the answer is yes [GL06].

$$n = 10, k = 5$$

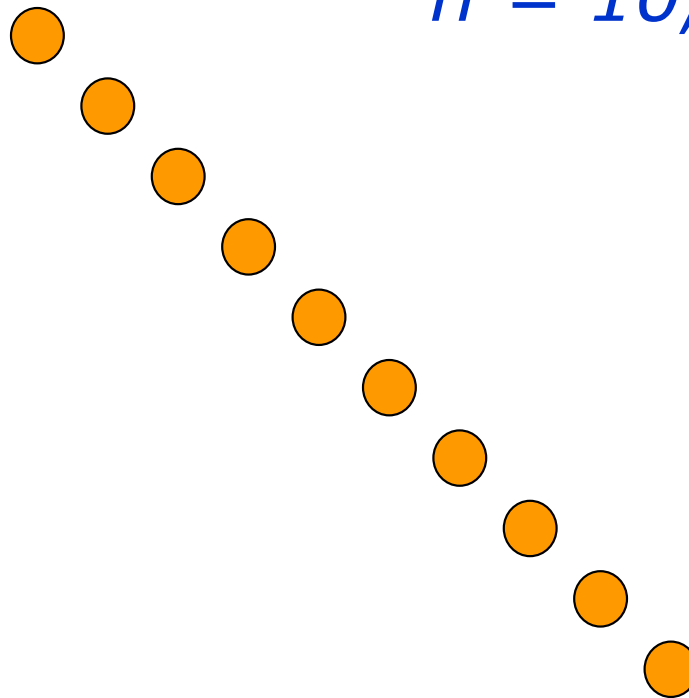


## Reduction Rule 2

---

- If  $k = 1$ , then the answer is yes if and only if all points in  $S$  are co-linear [GL06].

$$n = 10, k = 1$$



## Reduction Rule 3

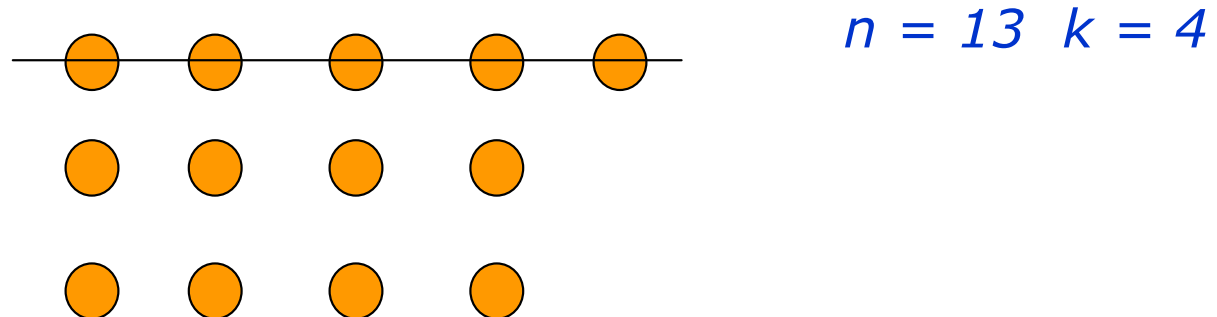
---

- If  $S$  has repeated points, then  $S$  can be simplified to a set with no repetitions and the answer for the simplified set is an answer for the original input [LM05].

# Reduction Rule 4

---

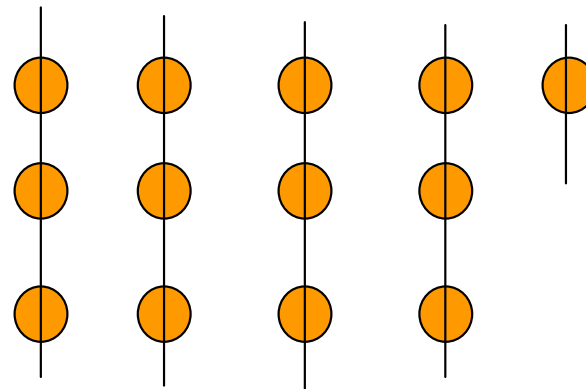
- If there is a set of  $k + 1$  or more co-linear points, draw a line through them and put the points in the cover; remove these points from further consideration [LM05].



# Reduction Rule 4

---

- If there is a set of  $k + 1$  or more co-linear points, draw a line through them and put the points in the cover; remove these points from further consideration [LM05].



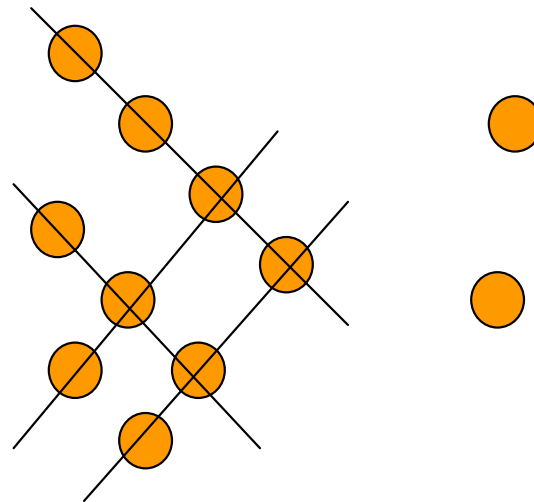
$n = 13 \quad k = 4$

Can't cover with 4 lines

# Reduction Rule 5

---

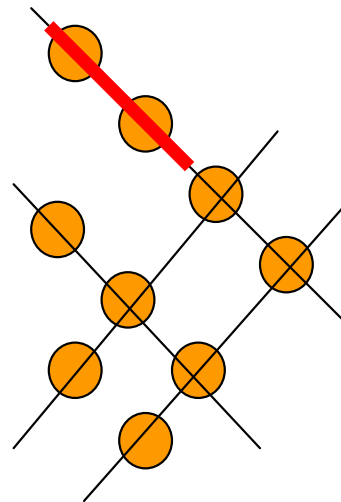
- Let  $L_3$  be the set of all lines that **cover at least 3 points** in  $S$  and  $cover(L_3)$  be all points in  $S$  cover by a line in  $L_3$ .
- Let  $p_1 \neq p_2$  be two points in  $S \setminus cover(L_3)$ . Then, the original instance has a yes answer iff the instance  $S \setminus \{p_1, p_2\}$  with parameter  $k-1$  has a yes answer.



# Reduction Rule 6

---

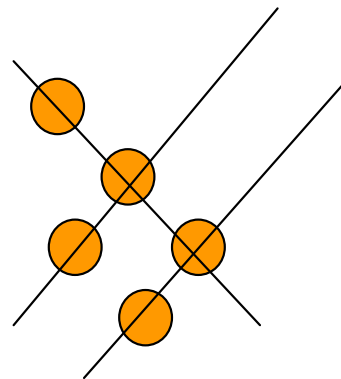
- Let  $p_1 \neq p_2$  be two points in  $cover(L_3)$ . Suppose that no other line in  $L_3$  besides  $\overline{p_1 p_2}$  covers  $p_1$  or  $p_2$ . Then, the original instance has a yes answer iff the instance  $S \setminus \{p_1, p_2\}$  with parameter  $k-1$  has a yes answer.



# Reduction Rule 6

---

- Let  $p_1 \neq p_2$  be two points in  $cover(L_3)$ . Suppose that no other line in  $L_3$  besides  $\overline{p_1 p_2}$  covers  $p_1$  or  $p_2$ . Then, the original instance has a yes answer iff the instance  $S \setminus \{p_1, p_2\}$  with parameter  $k-1$  has a yes answer.



# Kernelization

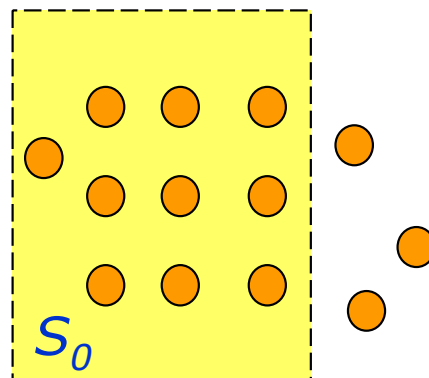
---

- What is kernelization?
- What is the problem kernel?
- The problem kernel of the LINE COVER problem has at most  $k^2$  points. How?

# Kernel Lemma

---

- If there is a subset  $S_0$  of  $S$  so that  $|S_0| \geq k^2 + 1$ , the largest number of co-linear points is  $k$ , then the answer is no [GL06].
- **Proof:**
  - Each of these lines covered at most  $k$  points
  - Any cover of  $S_0$  with  $k$  lines would cover at most  $k^2$  points.
  - We cannot cover  $S_0$ , let alone  $S$ .



$$n = 13 \quad k = 3$$

$$|S_0| = 10$$

# Example of Preprocessing Algorithm

---

- Step 1:** Application of **Reduction Rule 1:**  
If  $n \leq 2k$ , answer YES and halt
- Step 2:** Application of **Reduction Rule 2:**  
If all points in  $S$  are co-linear, answer YES and halt
- Step 3:** Application of **Reduction Rule 4:**  
Collect at most  $k^2+1$  points into a pool  $S_0$  and remove a set of  $k+1$  or more co-linear points.  
If  $|S_0| > k^2$ , answer NO and halt
- Step 4:** Application of **Reduction Rule 1:**  
If  $n \leq 2k$ , answer YES and halt
- Step 5:** Construct  $L_3$ , a set of all lines through 3 or more co-linear points.
- Step 6:** Application of **Reduction Rule 5:**  
While there exist  $\{p_1, p_2\} \in S \setminus \text{cover}(L_3)$ ,  
do  $S = S \setminus \text{cover}(\overline{p_1, p_2})$ ,  $k = k-1$
- Step 7:** Repeat all the above steps until every rule can no longer be applied

# Example of Algorithm

## PRIORITIZE POINTS IN HEAVY LINES

---

**Step 1:**  $(S', k') \leftarrow$  The Preprocessing Algorithm  $(S, k)$

**Step 2:** Construct  $L_3$ , a set of all lines through 3 or more co-linear points in  $S'$ .

**Step 3: while** there exist  $\{p_1, p_2\} \in \text{cover}(L_3)$ , such that no other line in  $L_3$  besides  $\overline{p_1, p_2}$  covers  $p_1$  or  $p_2$  (Reduction Rule 6)

**Step 4: do**  $S' = S' \setminus \text{cover}\{\overline{p_1, p_2}\}$ ,  $k' = k' - 1$

**Step 5: return** AROUNDTHEPOINTS( $S', k'$ )

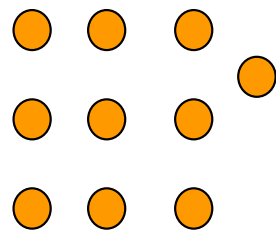
# Function AROUNDTHEPOINTS( $S',k$ )

---

Reduction Rule:

If among all  $\binom{n}{2}$  lines there is no line with at least  $\lceil n/k \rceil$  points, then the answer is no.

$n = 10$



*e.g.*

$$k = 2, \lceil n/k \rceil = 5$$

Answer is **NO**

$$k = 3, \lceil n/k \rceil = 4$$

Answer is **NO**

# Function AROUNDTHEPOINTS( $S',k$ )

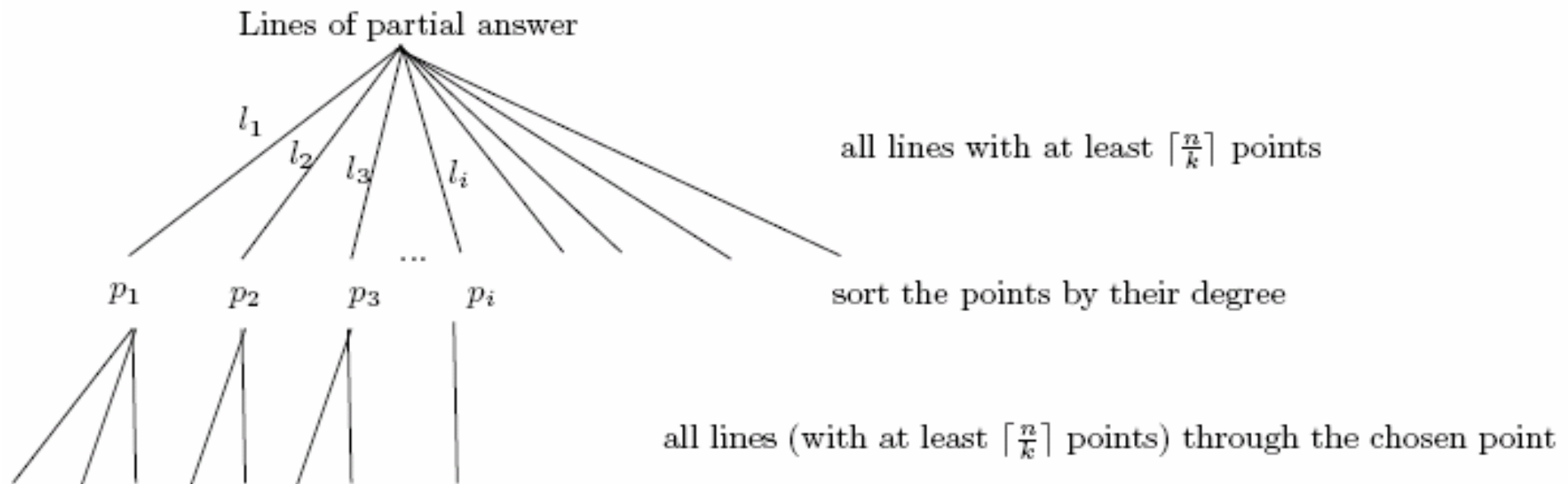
---

- If  $S$  can be covered with  $k$  lines, then there is one of the  $k$  lines in the cover of  $S$  covering at least  $\lceil n/k \rceil$  points.
  
- We make the following observation
  - There are  $\leq 3k^2/2$  lines containing the average number of points.
  - There are  $\leq 3k/2$  lines passing through a given point in the plane.

# Function AROUNDTHEPOINTS( $S',k$ )

---

- We create a new bounded search tree



# Algorithms for Decision Problem

---

## Our algorithms:

- |  |                                  |
|--|----------------------------------|
| 1) CASCADE-AND-SORT                    | $O(n \log k + k^{2k+2})$         |
| 2) CASCADE-FURTHER                     | $O(n \log k + k^{2k+2})$         |
| 3) PRIORITIZE POINTS IN<br>HEAVY LINES | $O(n \log k + k^4(k/2.22)^{2k})$ |

## Previous algorithms [LM02]:


- |                          |                     |
|--------------------------|---------------------|
| 1) BST-DIM-SET-COVER     | $O(k^{2k}n)$        |
| 2) KERNELIZE             | $O(n^3 + k^{2k+2})$ |
| 3) CASCADE-AND-KERNELIZE | $O(n^3 + k^{2k+2})$ |

# Algorithms for Decision Problem

---

## Our algorithms:

- |  |                                  |
|--|----------------------------------|
| 1) CASCADE-AND-SORT                    | $O(n \log k + k^{2k+2})$         |
| 2) CASCADE-FURTHER                     | $O(n \log k + k^{2k+2})$         |
| 3) PRIORITIZE POINTS IN<br>HEAVY LINES | $O(n \log k + k^4(k/2.22)^{2k})$ |



CASCADE-AND-SORT sorts the points according to their weights before solving the problem kernel.

# Algorithms for Decision Problem

---

## Our algorithms:

- |                                     |                                  |
|-------------------------------------|----------------------------------|
| 1) CASCADE-AND-SORT                 | $O(n \log k + k^{2k+2})$         |
| 2) CASCADE-FURTHER                  | $O(n \log k + k^{2k+2})$         |
| 3) PRIORITIZE POINTS IN HEAVY LINES | $O(n \log k + k^4(k/2.22)^{2k})$ |

CASCADE-AND-SORT sorts the points according to their weights before solving the problem kernel.

CASCADE-FURTHER includes one more rule (Reduction Rule 6) before solving the problem kernel.

# Experimental results

- Table I: Average running times for the decision problem with 95% confidence intervals (10 random instances for each value of  $k$  and  $n$ ).

Algorithm	$k$ $n$	Running Time		
		6		
		30	50	5000
→ CASCADE-AND-SORT		$0.38 \pm 0.03s$	$0.41 \pm 0.05s$	$1.36 \pm 0.07s$
→ CASCADE FURTHER		$0.40 \pm 0.04s$	$0.41 \pm 0.04s$	$1.33 \pm 0.08s$
→ PRIORITIZE POINTS IN HEAVY LINES		$0.41 \pm 0.04s$	$0.44 \pm 0.05s$	$1.34 \pm 0.07s$
BST-DIM-SET-COVER		$223 \pm 90s$	$525 \pm 126s$	$\approx 15hr$
KERNELIZE		$2.71 \pm 1.58s$	$0.17 \pm 0.09s$	$6.81 \pm 0.76s$
CASCADE-AND-KERNELIZE		$0.12 \pm 0.06s$	$0.07 \pm 0.03s$	$6.59 \pm 0.61s$

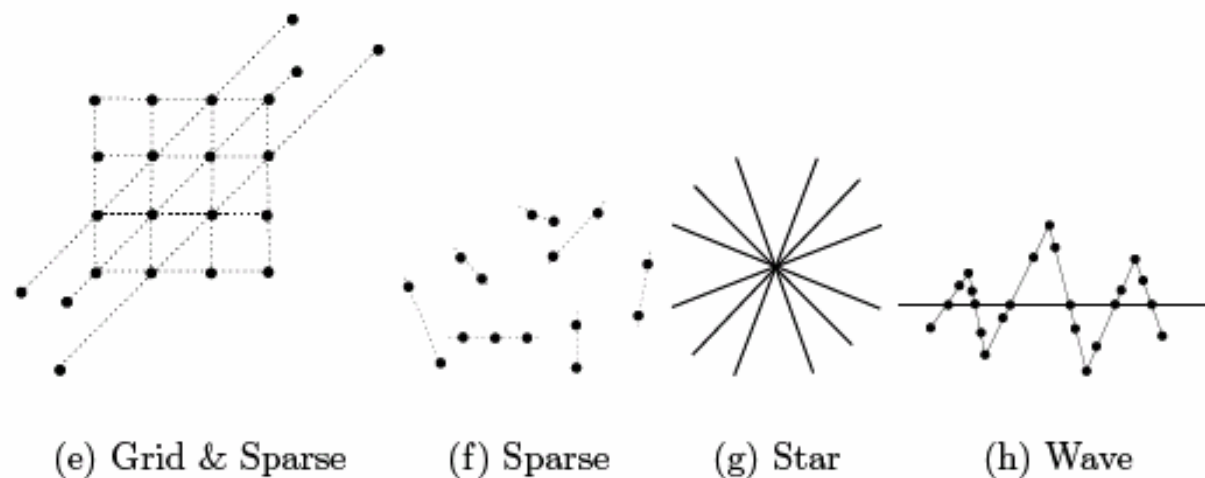
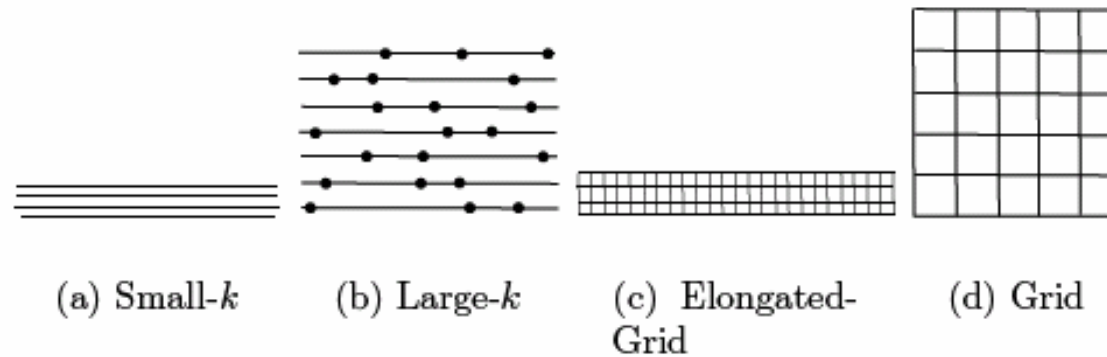
# Experimental results

- Table II: Average running times for the decision problem with 95% confidence intervals (10 random instances for each value of  $k$  and  $n$ ).

Algorithm	$k$ $n$	Running Time		
		7		
		30	50	5000
→ CASCADE-AND-SORT		$0.98 \pm 0.14s$	$0.70 \pm 0.05s$	$1.71 \pm 0.12s$
→ CASCADE FURTHER		$1.17 \pm 0.19s$	$0.72 \pm 0.05s$	$1.64 \pm 0.10s$
→ PRIORITIZE POINTS IN HEAVY LINES		$1.18 \pm 0.20s$	$0.74 \pm 0.07s$	$1.72 \pm 0.13s$
BST-DIM-SET-COVER		$\approx 3hr$	$\approx 11hr$	$\gg 24hr$
KERNELIZE		$\approx 3hr$	$2.19 \pm 1.99s$	$7.72 \pm 0.51s$
CASCADE-AND-KERNELIZE		$\approx 3hr$	$0.21 \pm 0.11s$	$8.69 \pm 1.05s$

# More results ...

- We also evaluate when the structured instances are given



# Algorithms for Optimization Problem

---

## Our algorithms:

1) ONE INCREMENTS

$$O(nk \log k + k^4(k/2.22)^{2k})$$

2) TAKE A GUESS

$$O(n^3 + k^4(k/2.22)^{2k})$$

3) BINARY SEARCH

$$O(n \log^2 k + k^4 \log k (k/1.11)^{4k})$$

## Previous algorithms [GL06]:

EXACTLINECOVER

$$O(n \log k + k^{2k+2})$$

# Algorithms for Optimization Problem

---

## Our algorithms:

1) ONE INCREMENTS

$$O(nk \log k + k^4 (k/2.22)^{2k})$$

2) TAKE A GUESS

$$O(n^3 + k^4 (k/2.22)^{2k})$$

3) BINARY SEARCH

$$O(n \log^2 k + k^4 \log k (k/1.11)^{4k})$$



ONE INCREMENTS starts with  $k' = 1$  and continue until we have  $k' = k$ .

# Algorithms for Optimization Problem

---

## Our algorithms:

1) ONE INCREMENTS

$$O(nk \log k + k^4 (k/2.22)^{2k})$$

2) TAKE A GUESS

$$O(n^3 + k^4 (k/2.22)^{2k})$$

3) BINARY SEARCH

$$O(n \log^2 k + k^4 \log k (k/1.11)^{4k})$$

ONE INCREMENTS starts with  $k' = 1$  and continue until we have  $k' = k$ .

TAKE A GUESS improves the guess for the optimal  $k$  value based on reduction rules.

# Algorithms for Optimization Problem

---

## Our algorithms:

1) ONE INCREMENTS

$$O(nk \log k + k^4 (k/2.22)^{2k})$$

2) TAKE A GUESS

$$O(n^3 + k^4 (k/2.22)^{2k})$$

3) BINARY SEARCH

$$O(n \log^2 k + k^4 \log k (k/1.11)^{4k})$$

ONE INCREMENTS starts with  $k' = 1$  and continue until we have  $k' = k$ .

TAKE A GUESS improves the guess for the optimal  $k$  value based on reduction rules.

BINARY SEARCH doubles the  $k'$  value until we succeed before performing binary search for the optimal  $k$  value.

# Algorithms for Optimization Problem

---

## Our algorithms:

1) ONE INCREMENTS

$$O(nk \log k + k^4(k/2.22)^{2k})$$

2) TAKE A GUESS

$$O(n^3 + k^4(k/2.22)^{2k})$$

3) BINARY SEARCH

$$O(n \log^2 k + k^4 \log k (k/1.11)^{4k})$$

## Previous algorithms [GL06]:

EXACTLINECOVER

$$O(n \log k + k^{2k+2})$$

*We omit the experimental results here.*

## Publication of the LINE COVER problem

---

- V. Estivill-Castro, A. Heednacram, and F. Suraweera. Reduction Rules Deliver Practical FPT-Algorithms for Covering Points and for TSP. *ACM Journal of Experimental Algorithmics*, 14:1.7--1.26, November 2009.

<http://portal.acm.org/toc.cfm?id=1498698>

# Other hard geometric problems and their progress

---

## 1. The Rectilinear Minimum-Links Spanning Path in Higher Dimensions

**Instance:** A set  $S$  of  $n$  points in  $\mathbb{R}^d$ , a positive integer  $k$

**Parameter:**  $k$

**Question:** Is there a piecewise linear path through  $n$  points in  $S$  with at most  $k$  links (axis-parallel line-segments)?

Our results: i) **NP-complete**, ii) **FPT**

## 2. The Rectilinear Hyperplane Cover in Higher Dimensions

**Instance:** A set  $S$  of  $n$  points in  $\mathbb{R}^d$ , a positive integer  $k$

**Parameter:**  $k$

**Question:** Is it possible to cover  $n$  points in  $S$  with at most  $k$  axis-parallel hyperplanes of  $d-1$  dimensions?

Our results: i) **NP-complete**, ii) **FPT**

# Other hard geometric problems and their progress

---

## 3. The MBTSP in 2D

**Instance:** A set  $S$  of  $n$  points in 2D, a positive integer  $k$   
**Parameter:**  $k$   
**Question:** Is there a piecewise linear tour through  $n$  points in  $S$  with at most  $k$  bends?

Our result: **FPT**

## 4. The Rectilinear MBTSP in 2D

**Instance:** A set  $S$  of  $n$  points in 2D, a positive integer  $k$   
**Parameter:**  $k$   
**Question:** Is there a piecewise linear tour through  $n$  points in  $S$  with at most  $k$  bends where every line-segment in the path is either horizontal or vertical?

Our result: **FPT**

# Conclusions

---

- The LINE COVER problem
  - new reduction rules
  - 3 algorithms for decision problem
  - 3 algorithms for optimization problem
  - Efficient FPT algorithms
  
- Other hard geometric problems
  - The Rectilinear Minimum-Links Spanning Path in Higher Dimensions
  - The Rectilinear Hyperplane Cover in Higher Dimensions
  - The MBTSP in 2D
  - The Rectilinear MBTSP in 2D

---

Thank you

