

# Schematization with and without geography

Middlesex University  
November 17th, 2015



Wouter Meulemans

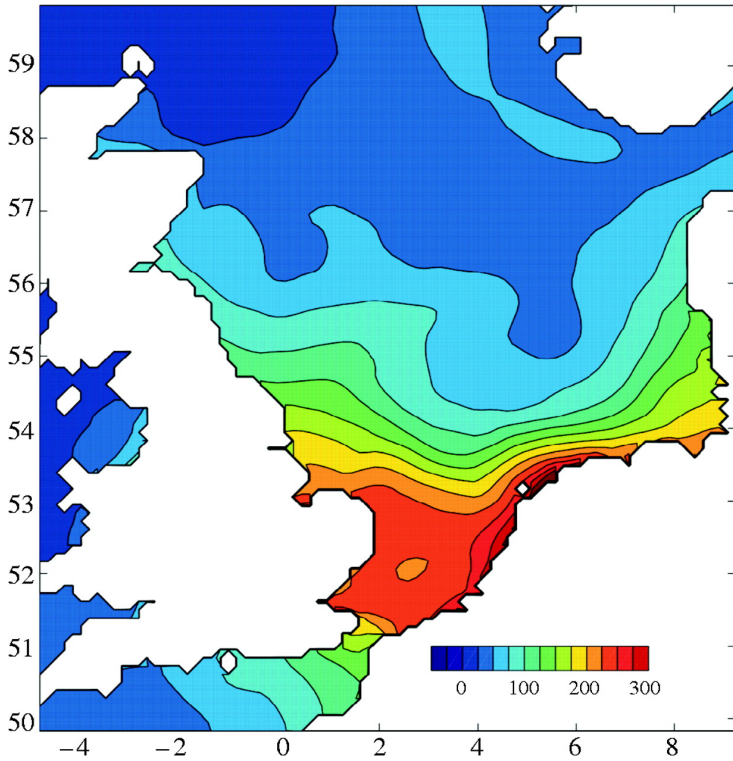
CITY UNIVERSITY  
LONDON

EST 1894

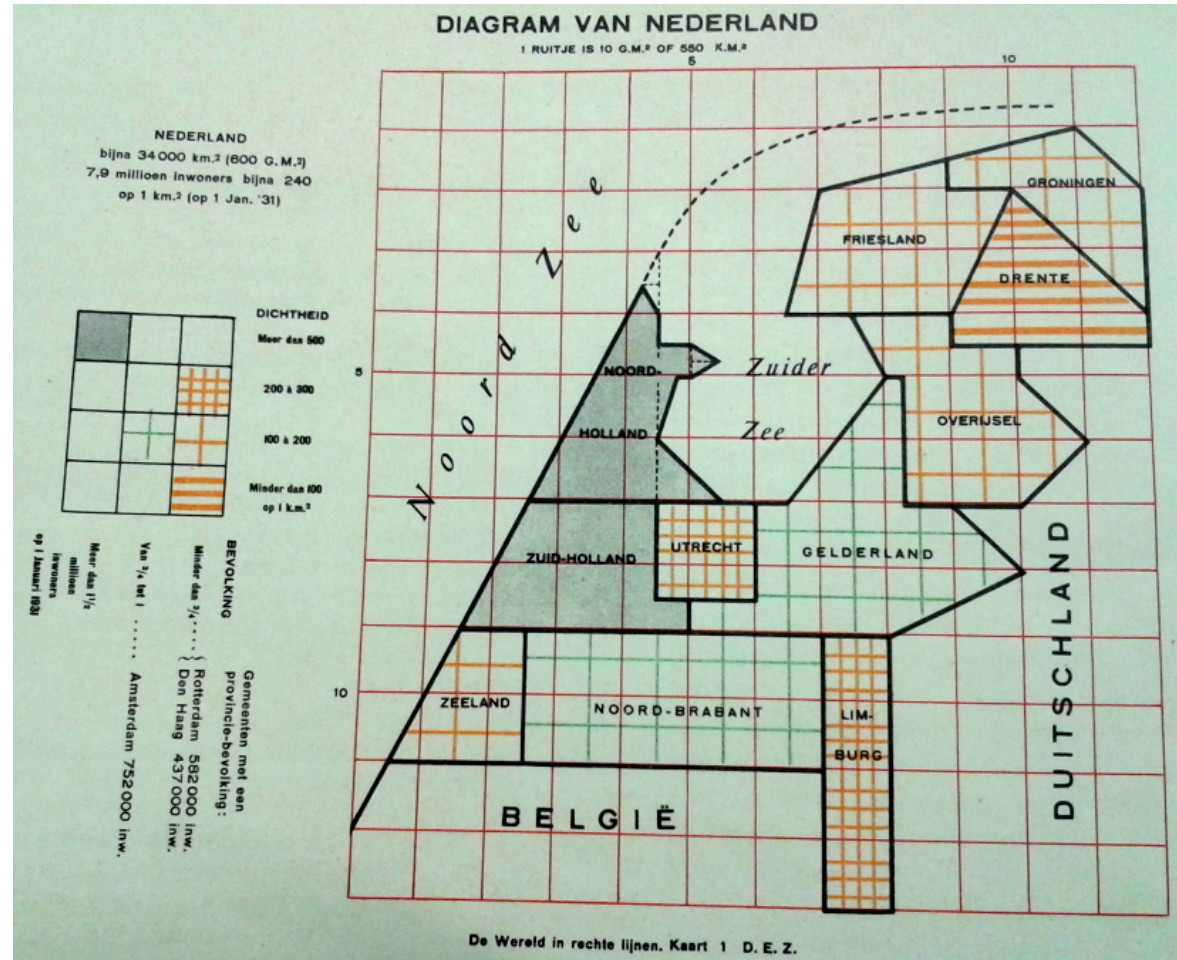
# A schematic map



# More than transit maps!

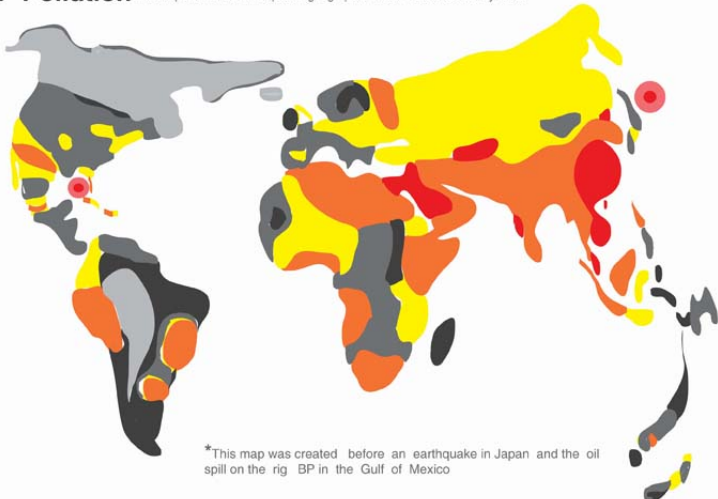


[Wolf & Flather, 2005]



[Zuidhof, 1932]

**Water Pollution** This map shows the anticipated geographic water stress levels by 2020



\*This map was created before an earthquake in Japan and the oil spill on the rig BP in the Gulf of Mexico

● Potential Conflict ● Severe Shortage ● Large - Scale Shortage ● Some Shortage ● Adequate Supply ● Limited Inhabitants

[<http://ftrctlb.com/node/169>]

# Methods

	Networks	Regions
Lines	<p>[Cabello et al, 2005]</p> <p>[Merrick &amp; Gudmundsson, 2007]</p> <p>[Nöllenburg &amp; Wolff, 2010]</p>	<p>[Buchin et al, 2011]</p> <p>[Cicerone &amp; Cermignani, 2012]</p> <p>[Buchin et al, to appear]</p>
Bézier	<p>[Fink et al, 2013]</p>	<p>[Van Goethem et al, 2013]</p>
Circular arcs	<p>[Fink et al, 2014]</p> <p>[Van Goethem et al, 2014]</p>	<p>[Drysdale et al, 2008]</p> <p>[Heimlich &amp; Held, 2008]</p> <p>[Van Goethem et al, 2013]</p> <p>[Van Goethem et al, 2015]</p>

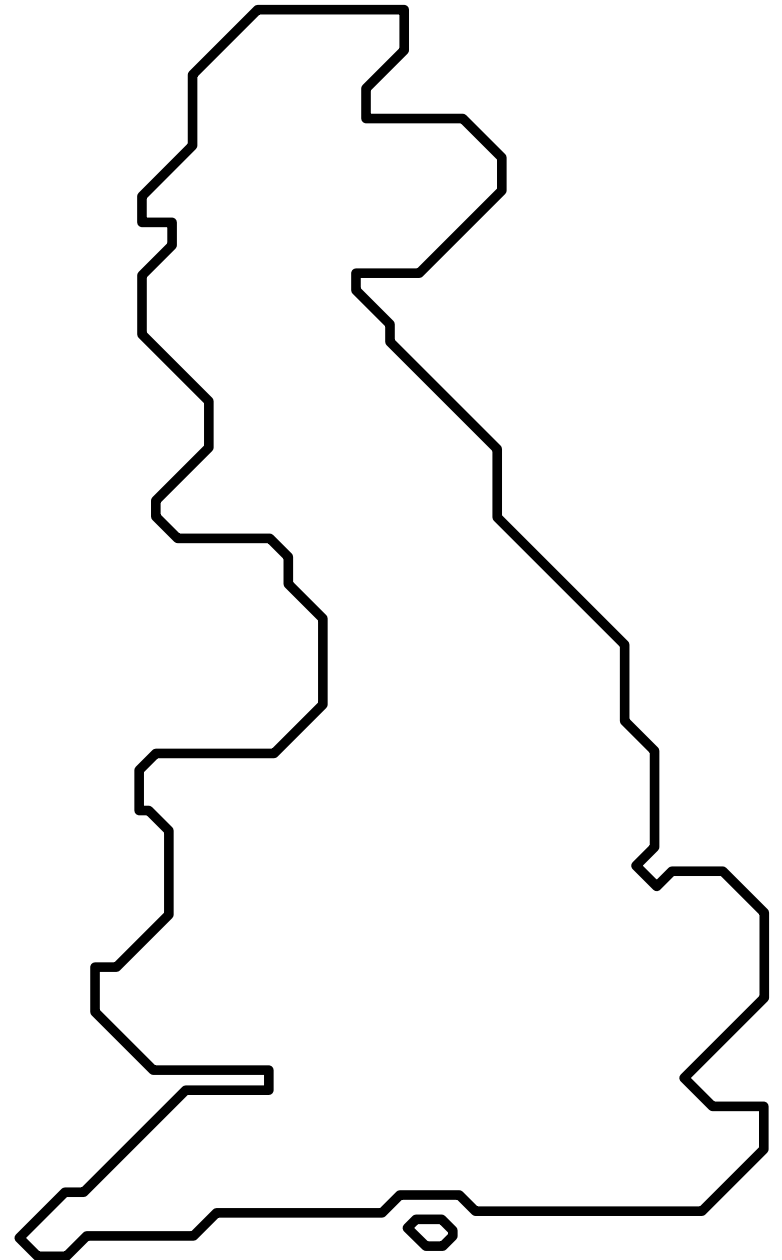
# Methods

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# Requirements

## Few geometric objects

At most  $k$  lines (parameter)



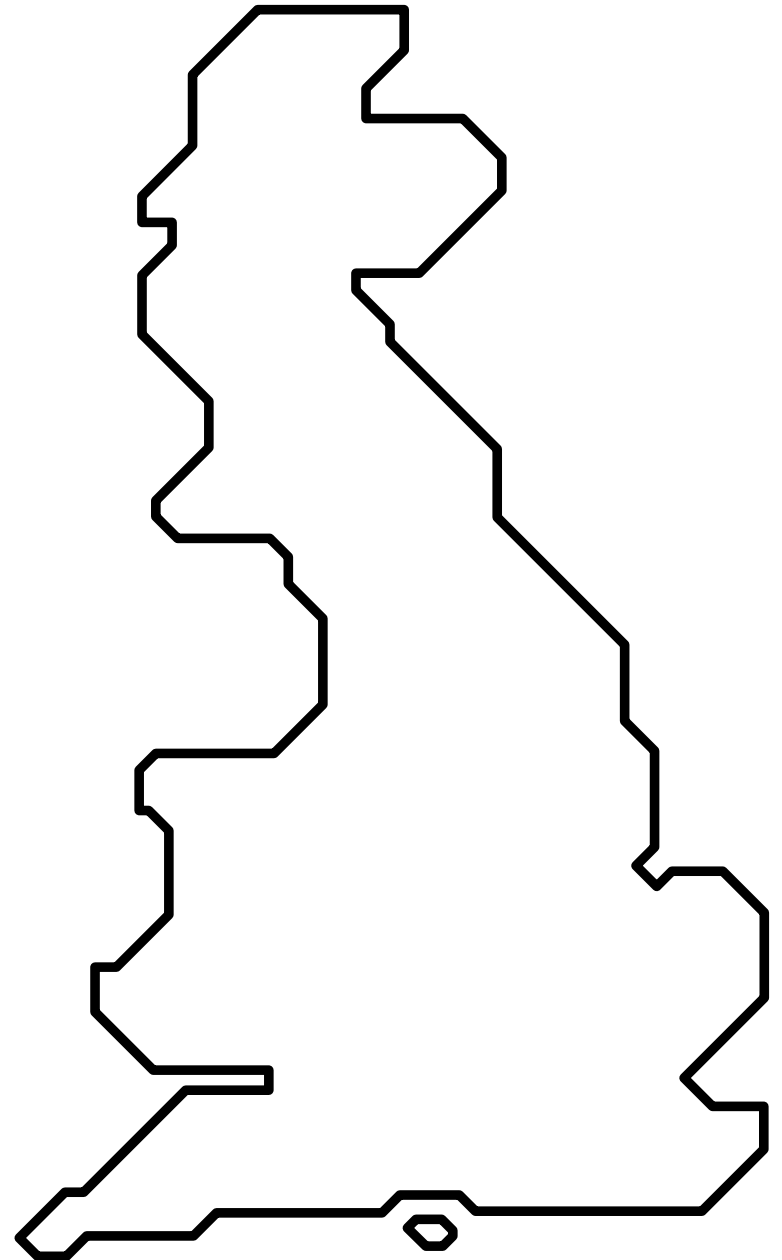
# Requirements

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Angles in set  $\mathcal{C}$  (parameter)



# Requirements

## Few geometric objects

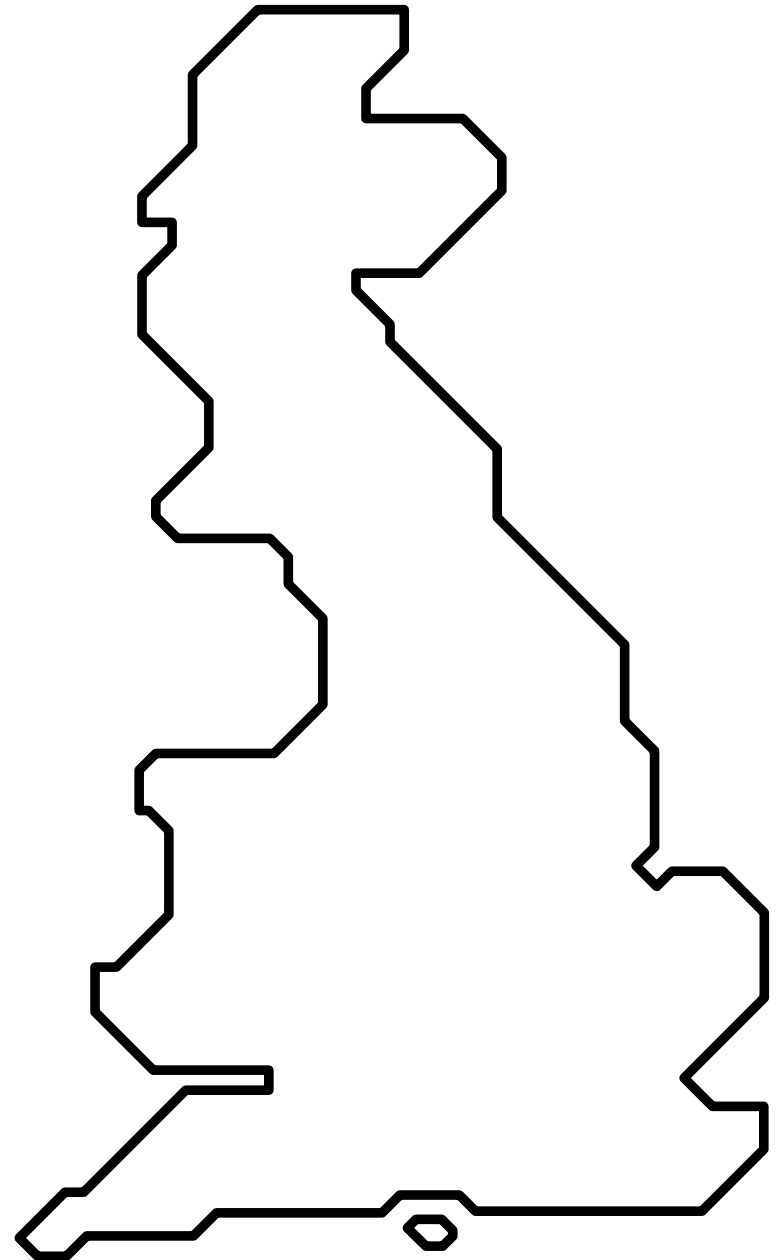
At most  $k$  lines (parameter)

## Restricted geometry

Angles in set  $\mathcal{C}$  (parameter)

## Topology

Correct neighbors





# Requirements

## Few geometric objects

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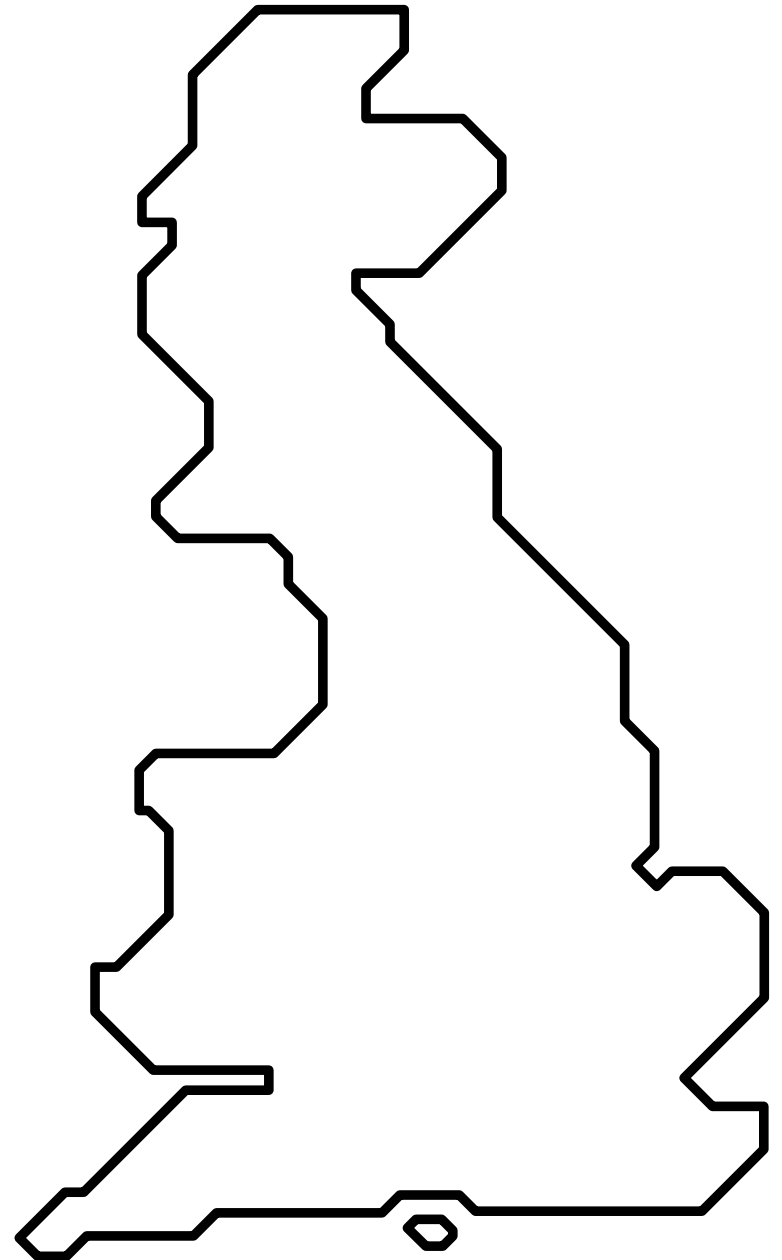
Angles in set  $\mathcal{C}$  (parameter)

## Topology

Correct neighbors

## Resemblance

Area preservation



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At most  $k$  lines (parameter)

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Angles in set  $\mathcal{C}$  (parameter)

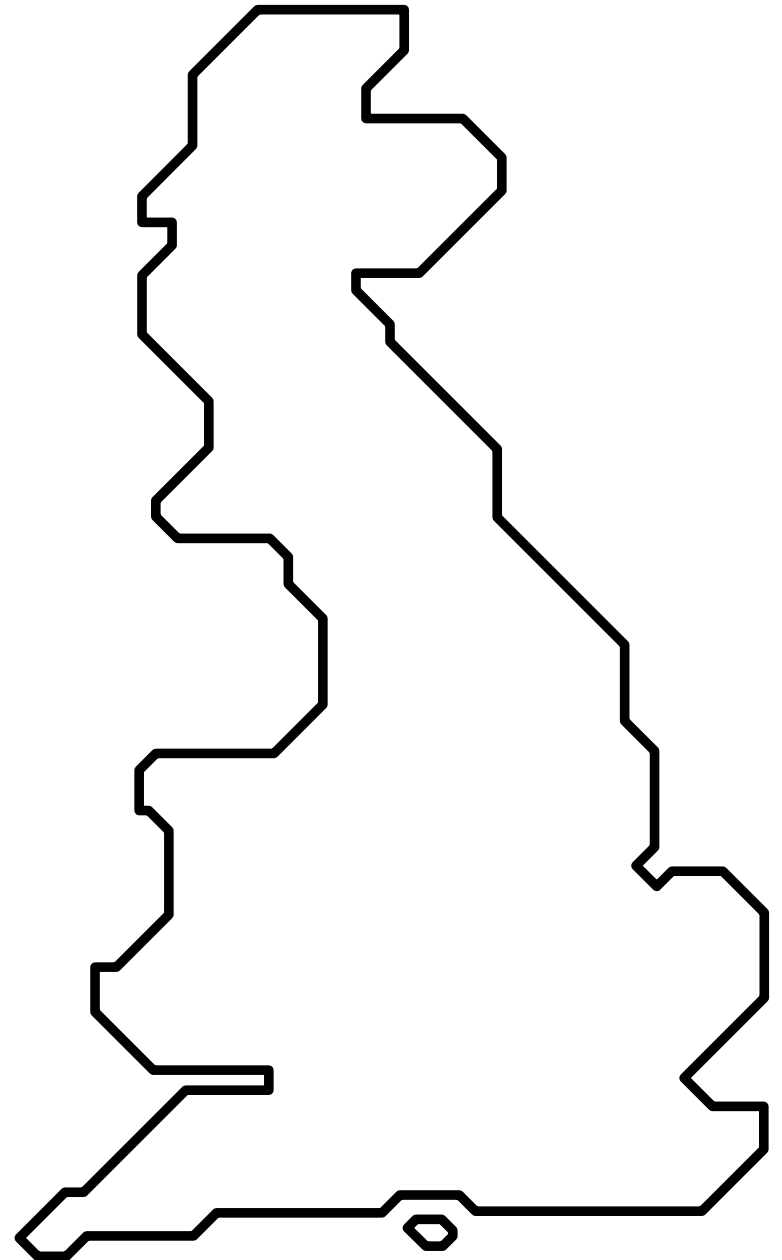
## Topology

Correct neighbors

## Resemblance

Area preservation

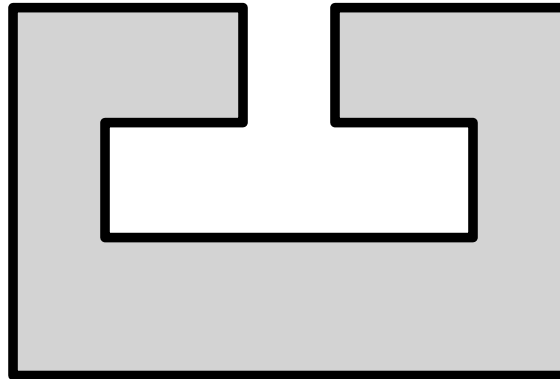
Measure something...?



# Formalizing “resemblance”?

Let’s optimize **symmetric difference**

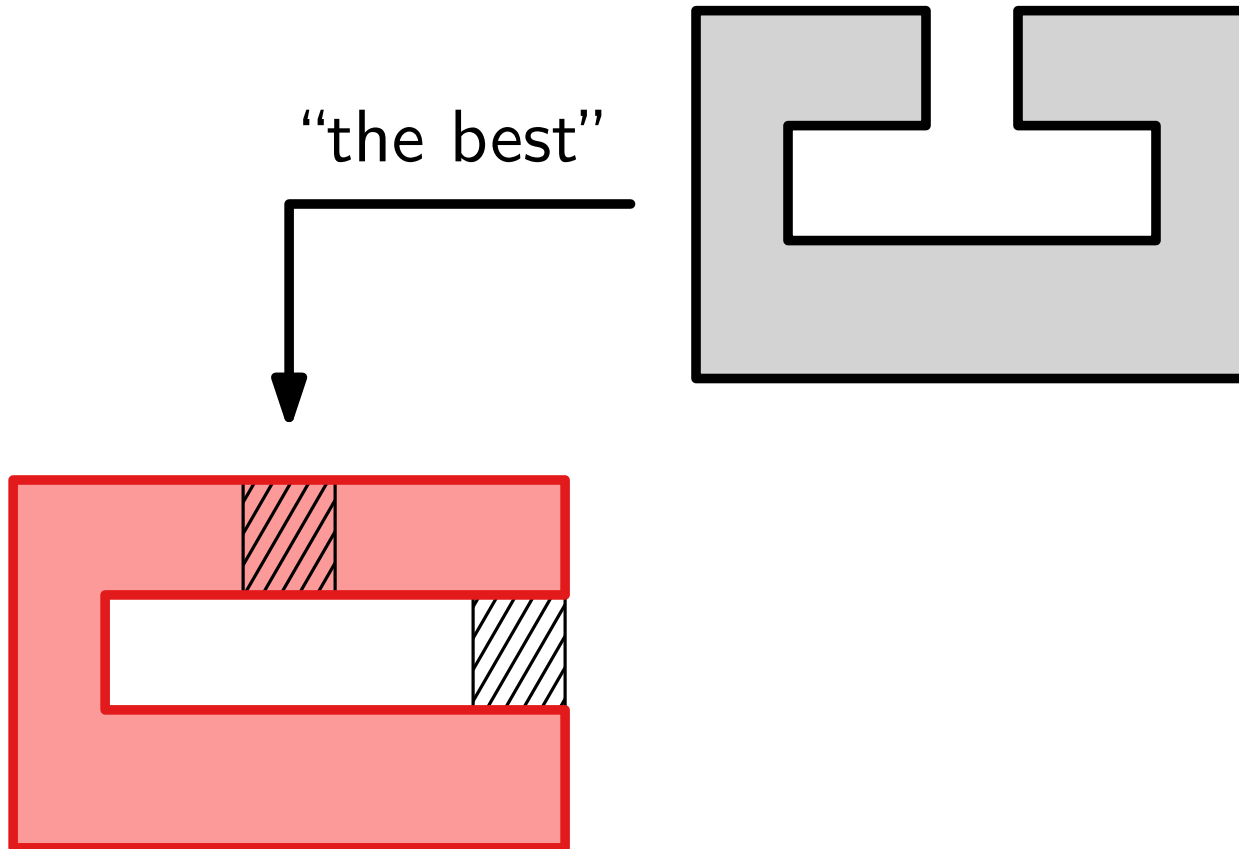
“**area** covered by exactly one polygon”



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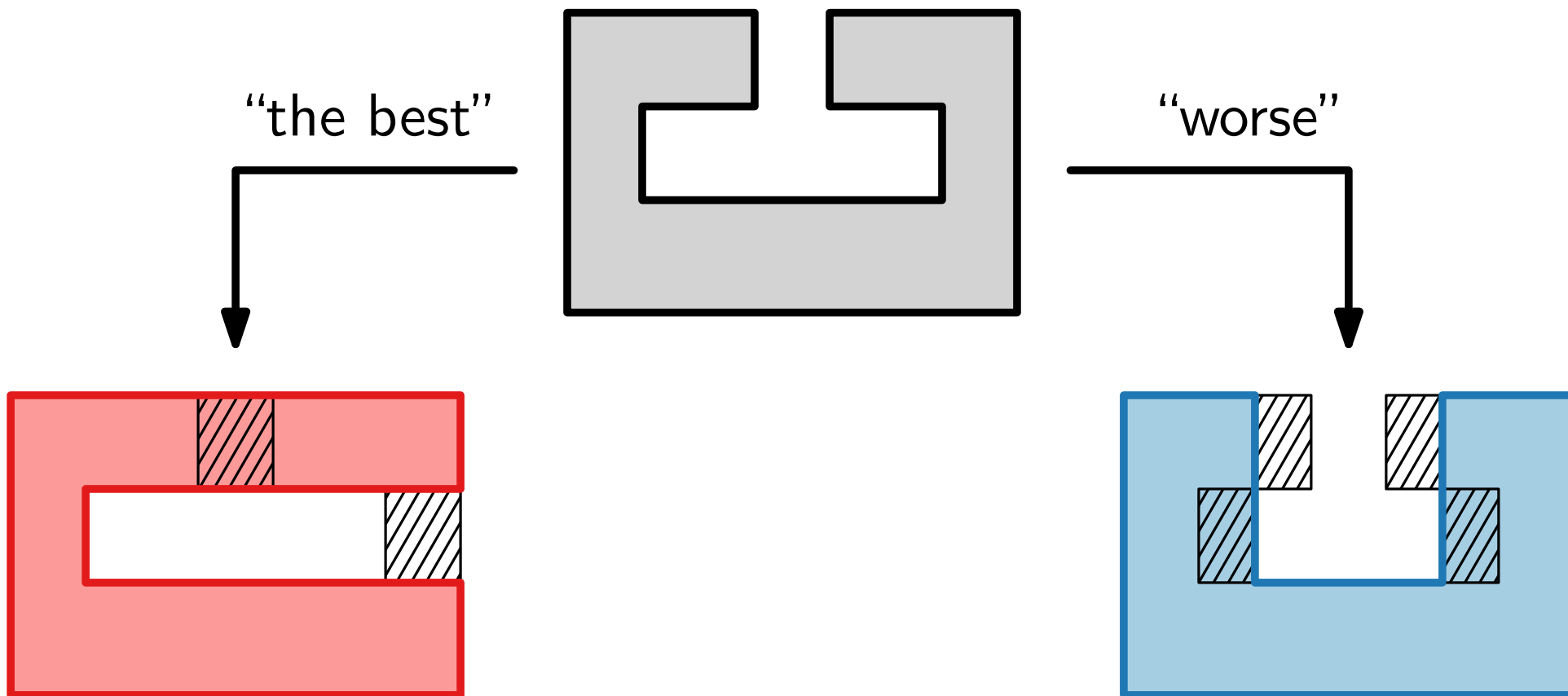
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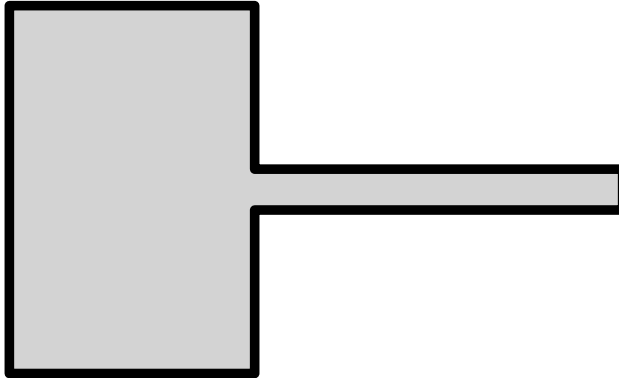
“**area** covered by exactly one polygon”



# Formalizing “resemblance” ?

Let’s try again: **Fréchet distance**

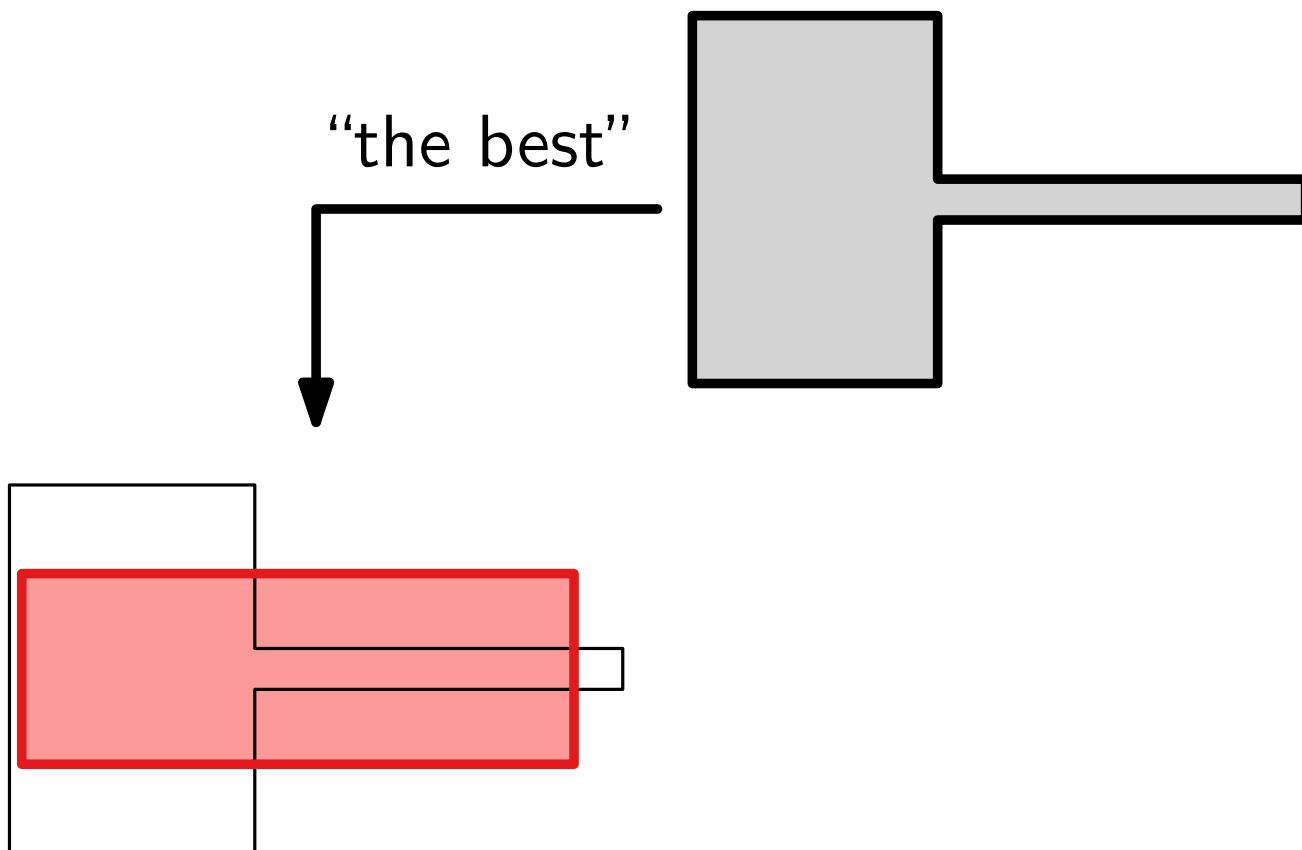
“**longest distance** between boundaries, accounting for continuity”



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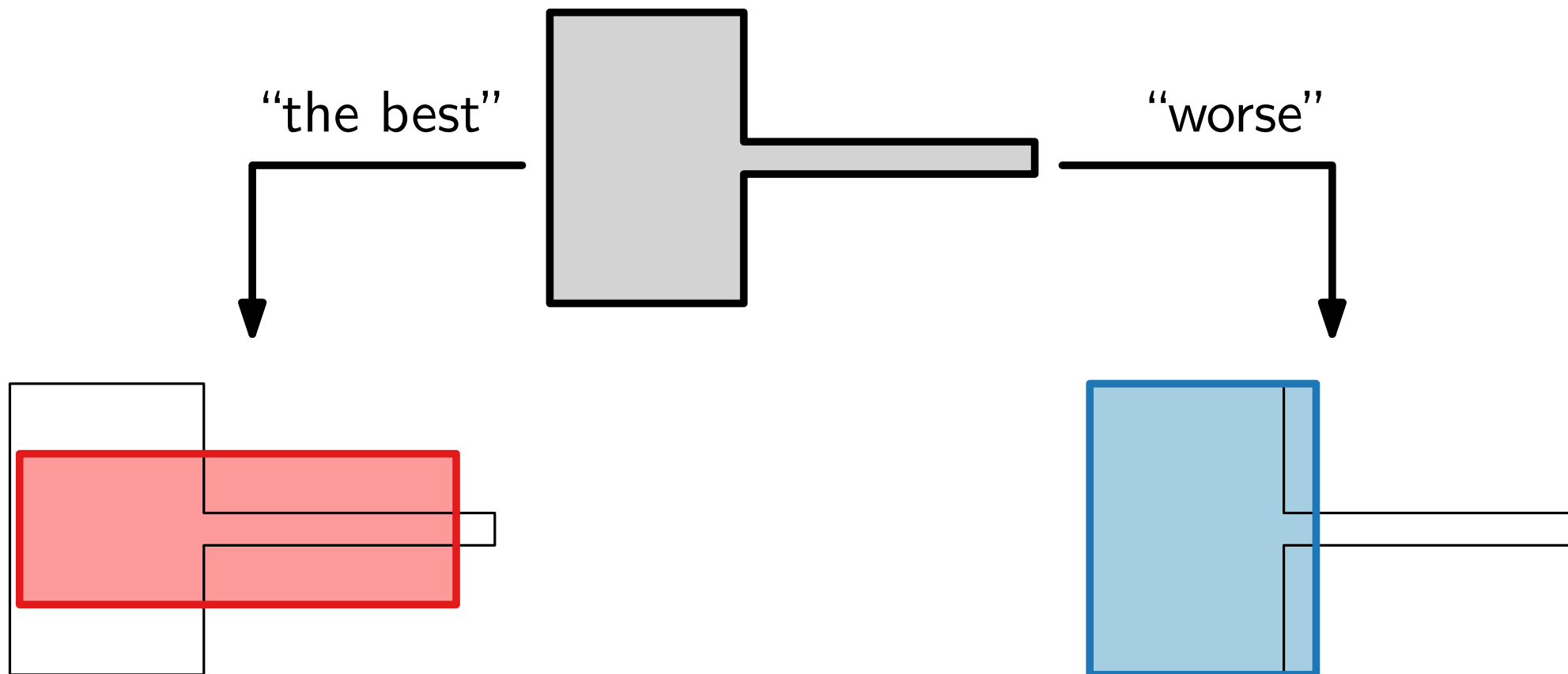
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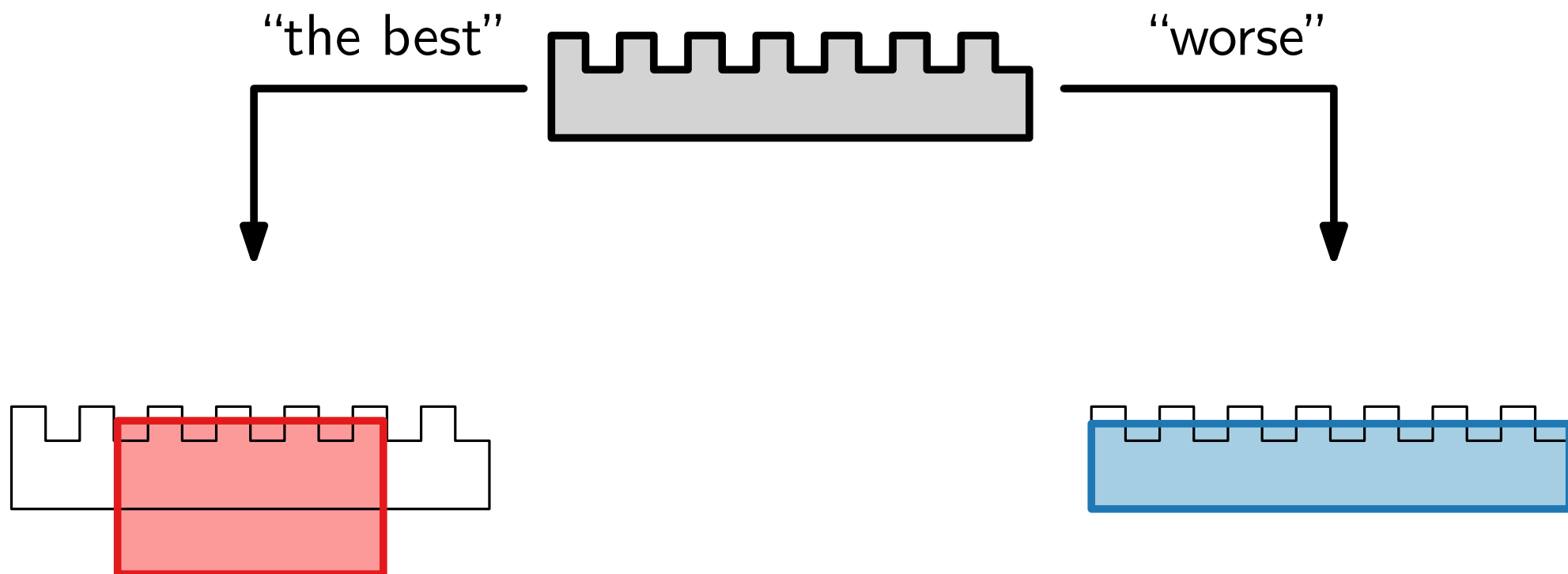




# Formalizing “resemblance”?

Once more: **cyclic dynamic time warp distance**

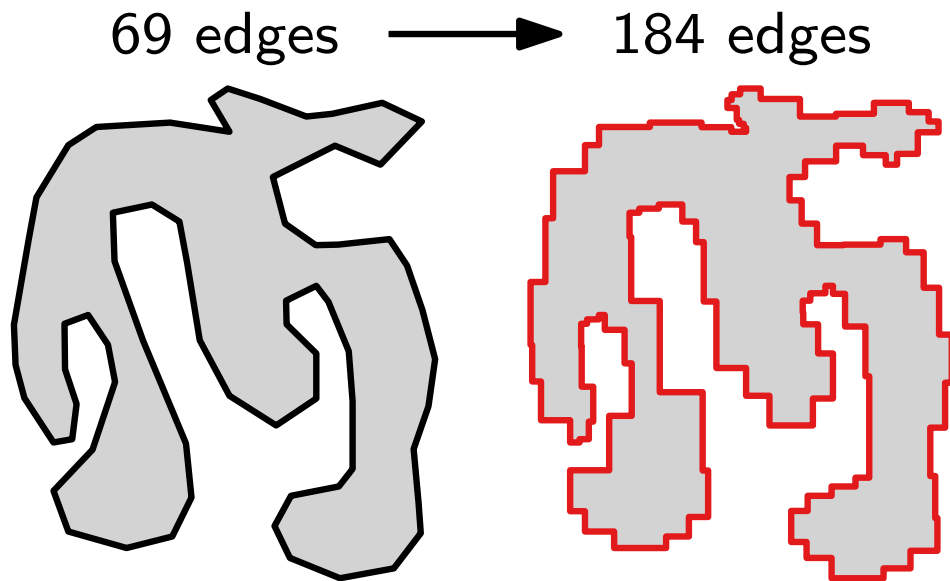
“**Sum of distances** between vertices, accounting for continuity”



# Algorithm

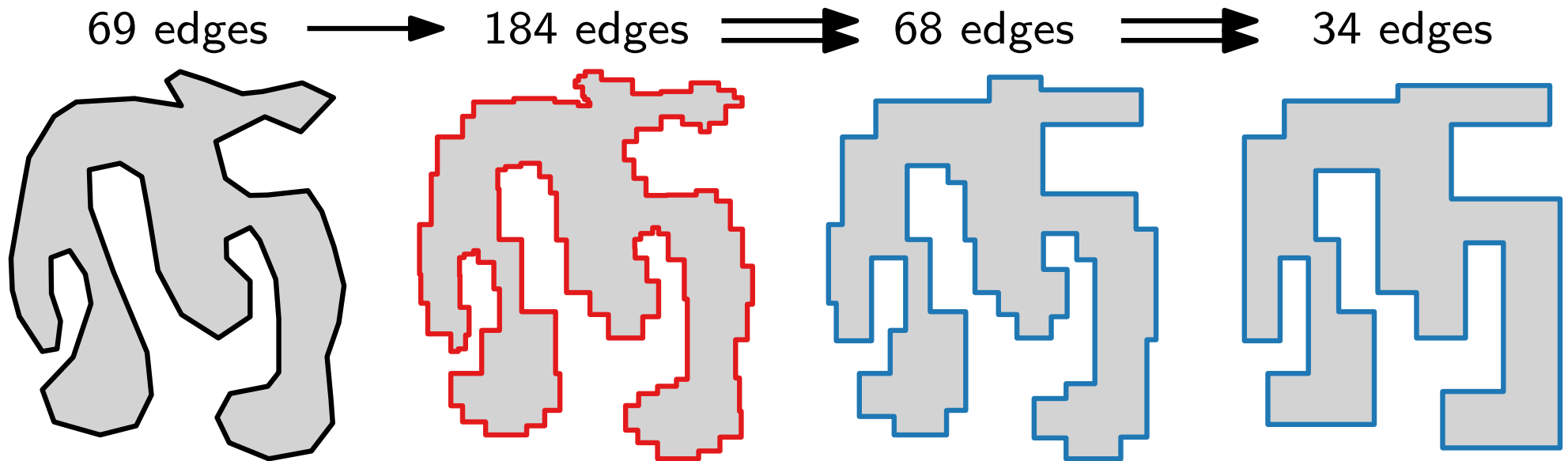
# Algorithm

1. restrict angles to  $\mathcal{C}$



# Algorithm

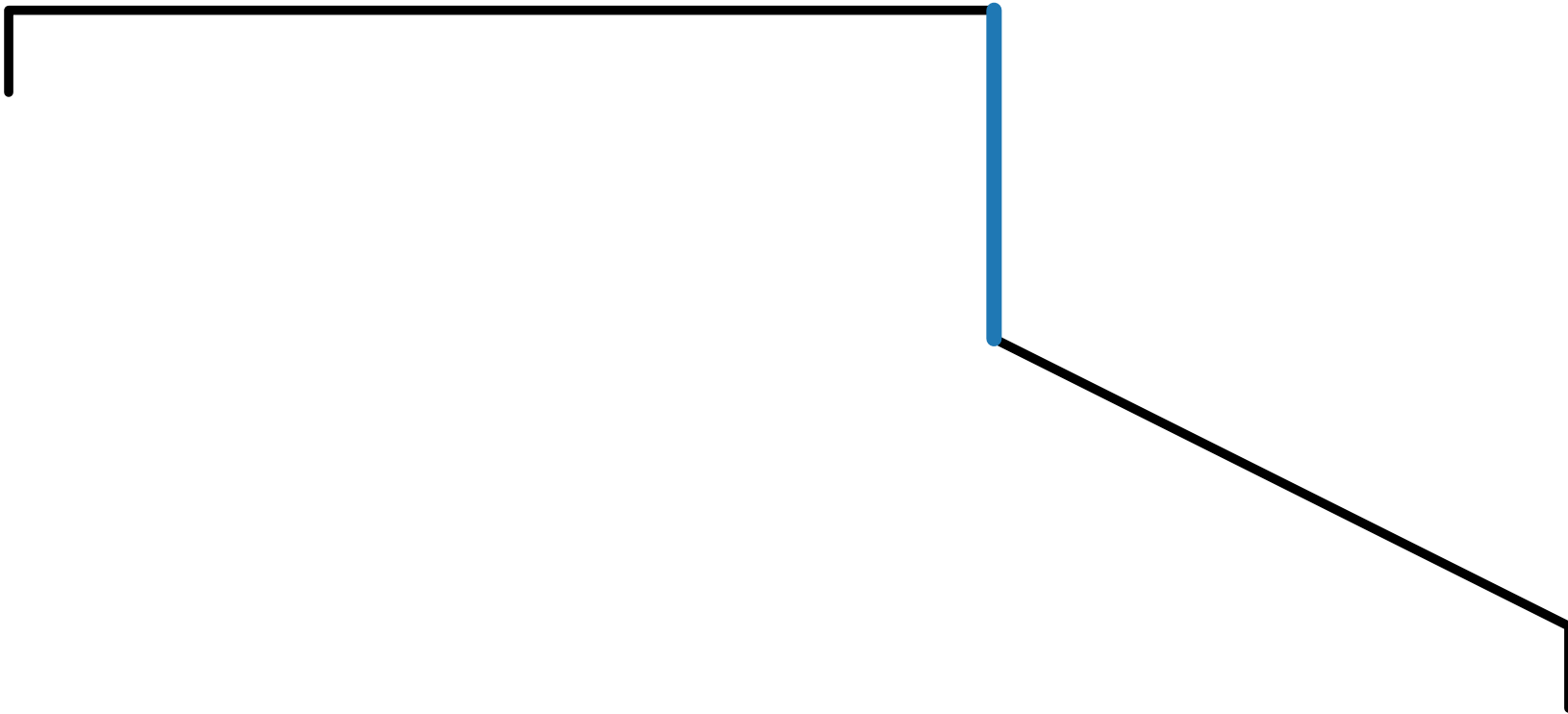
1. restrict angles to  $\mathcal{C}$
2. repeat
3.     perform a pair of edge-moves
4. until at most  $k$  lines



# Edge-moves

3. perform a pair of **edge-moves**

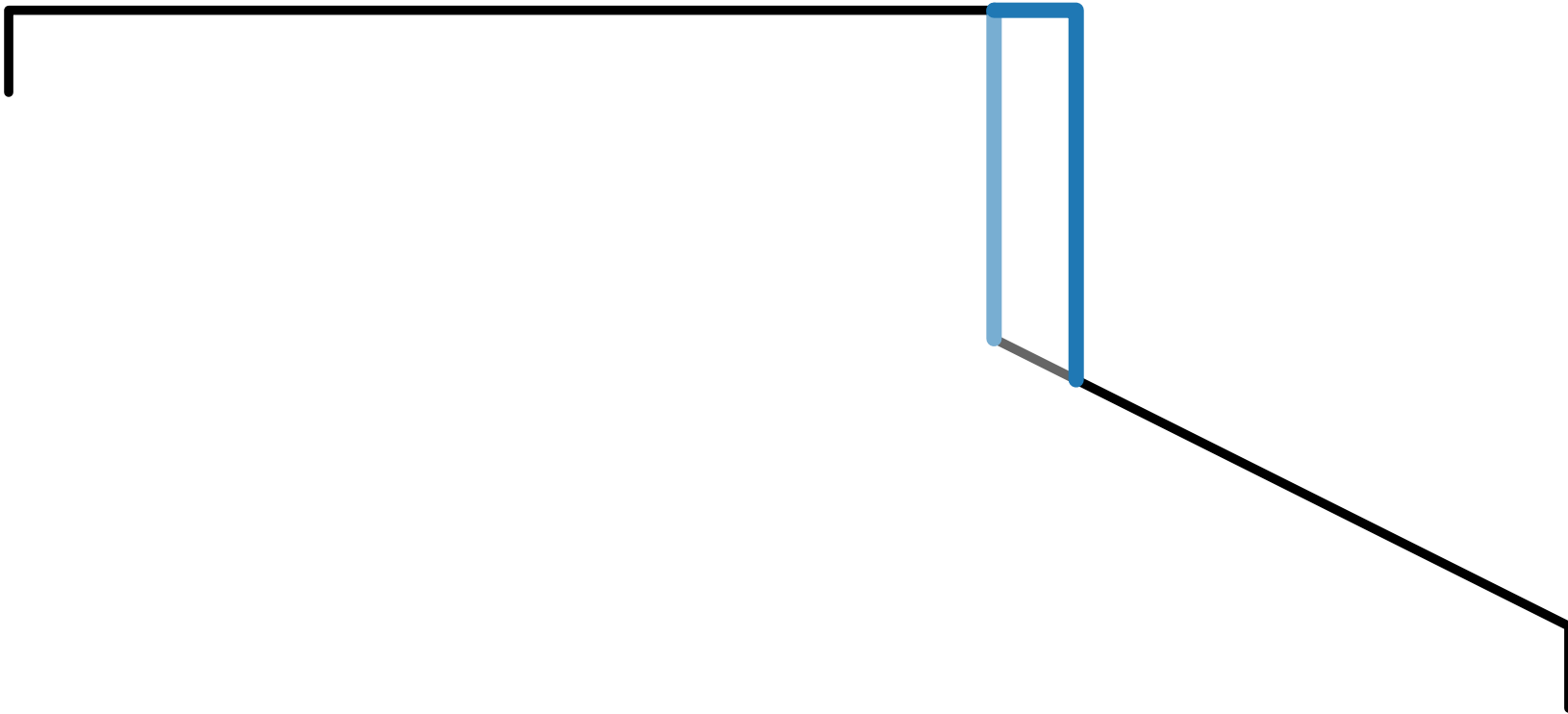
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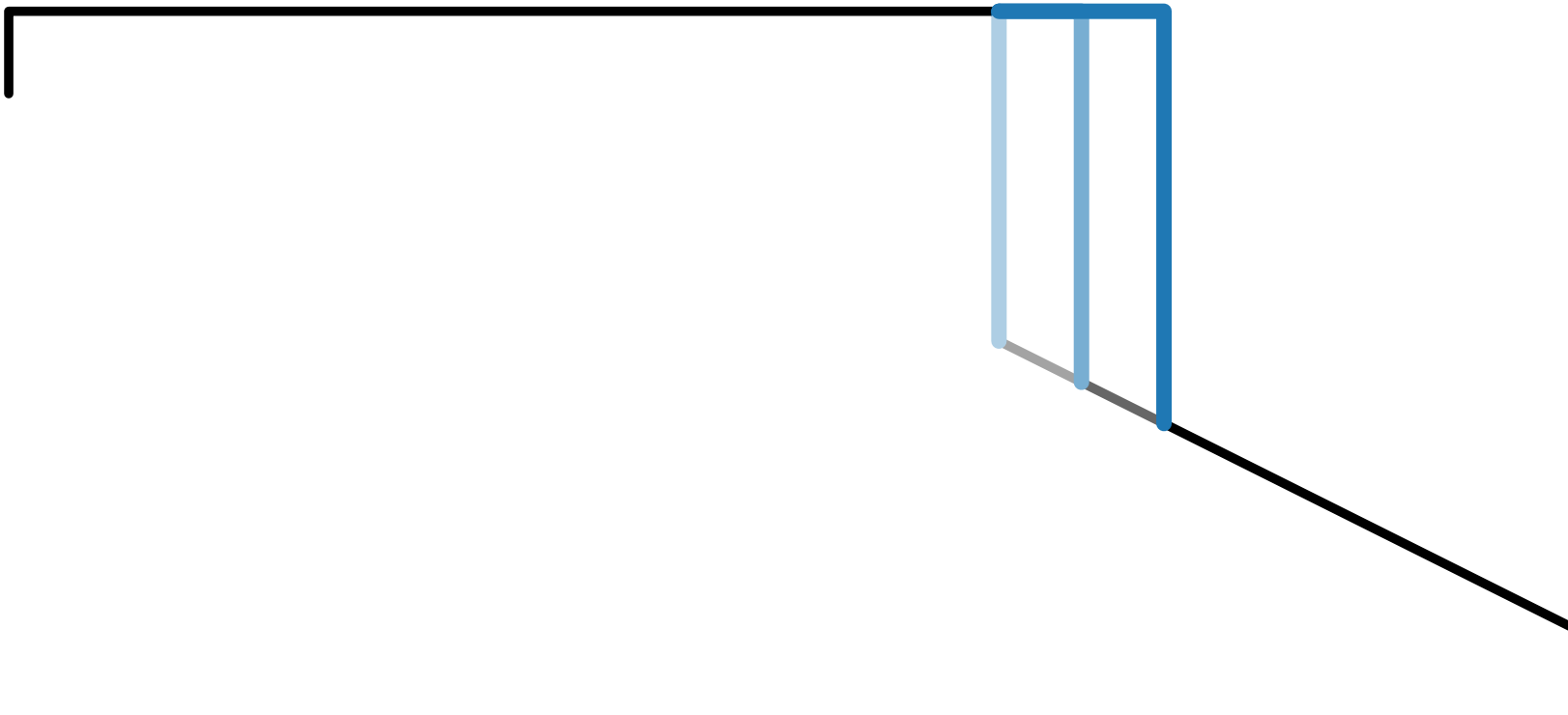
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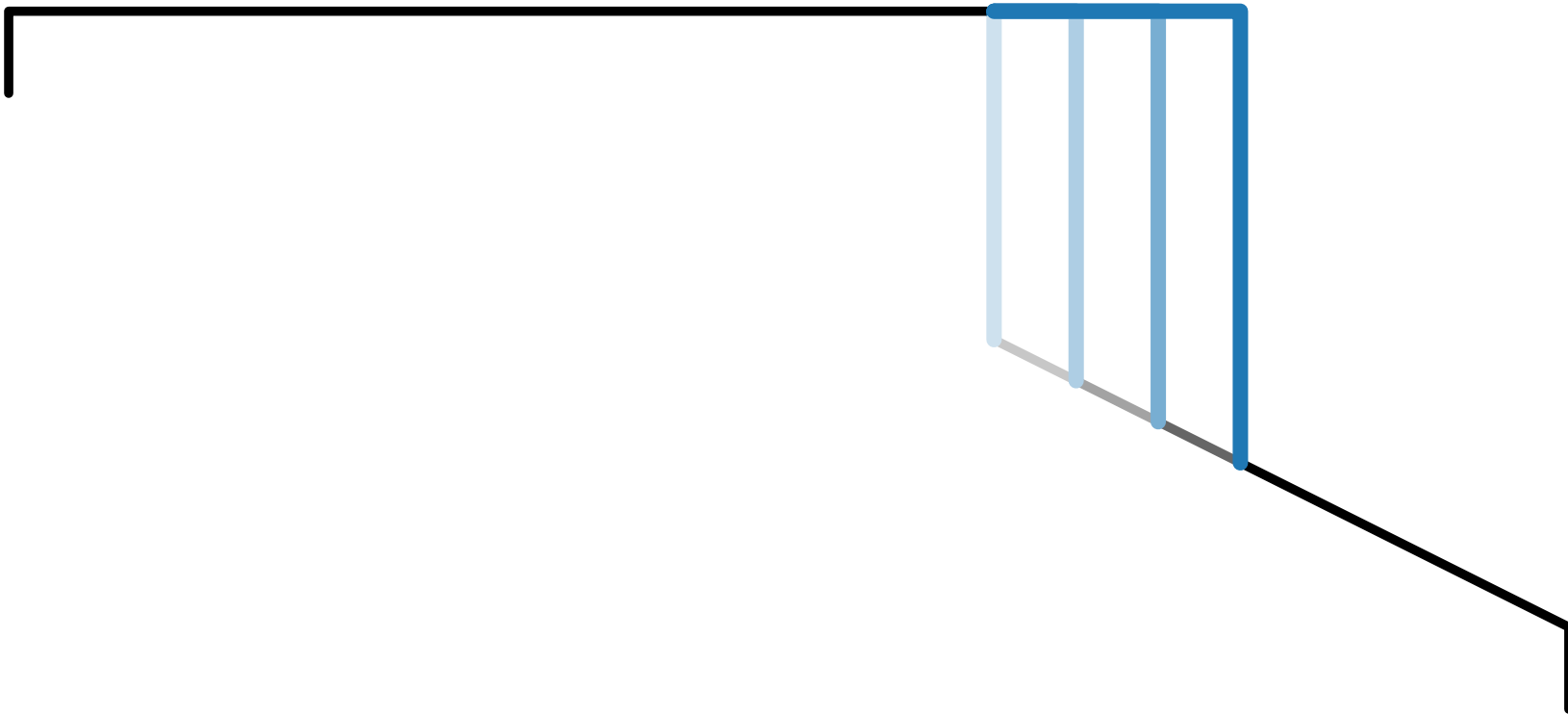
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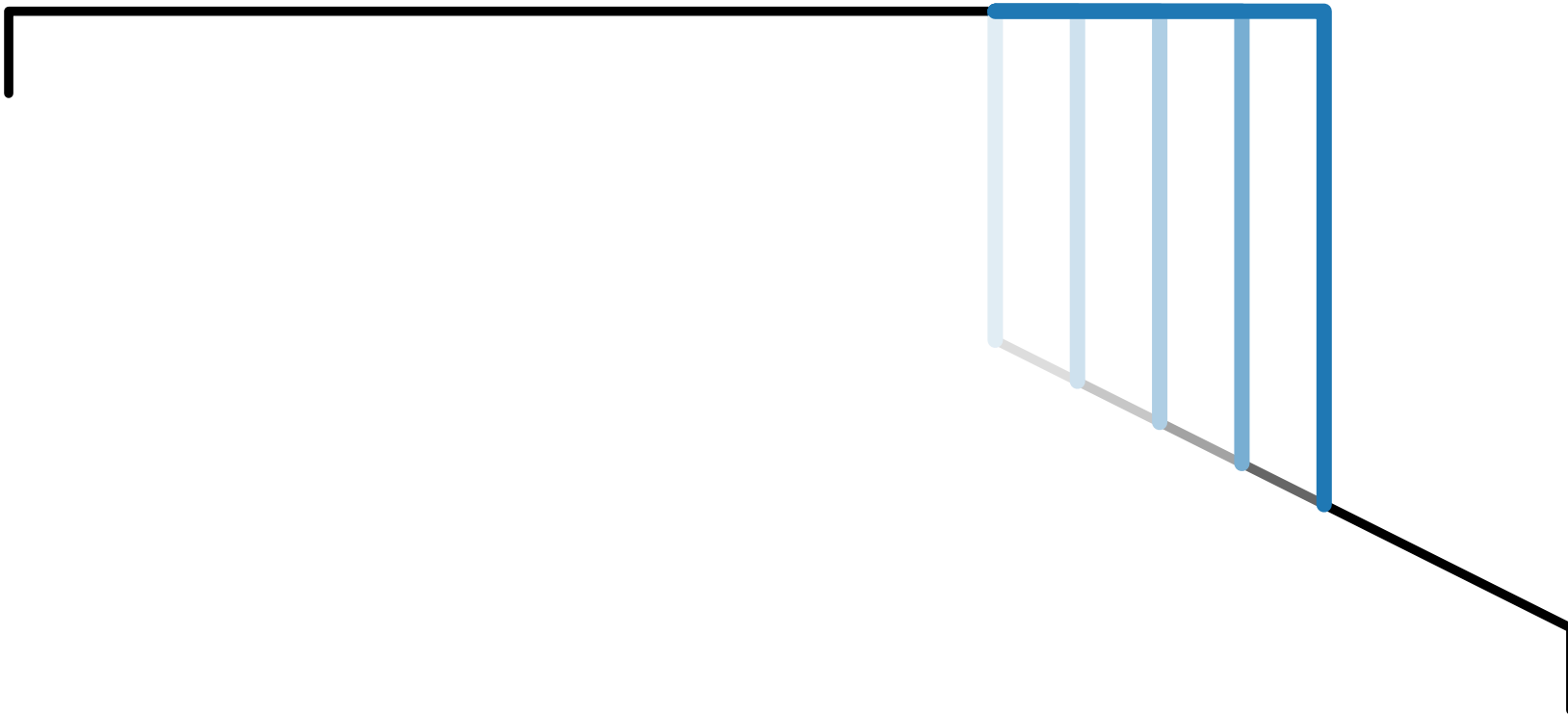




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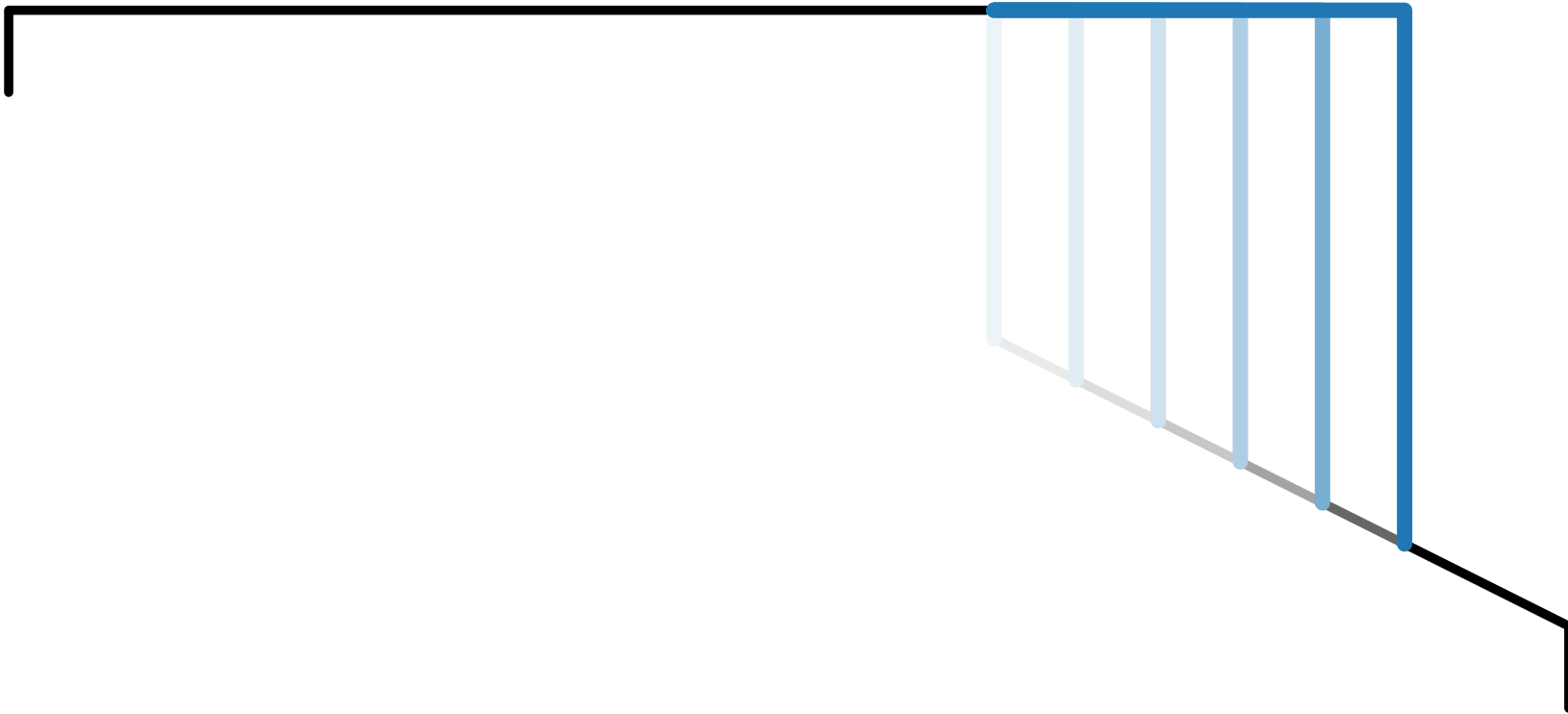
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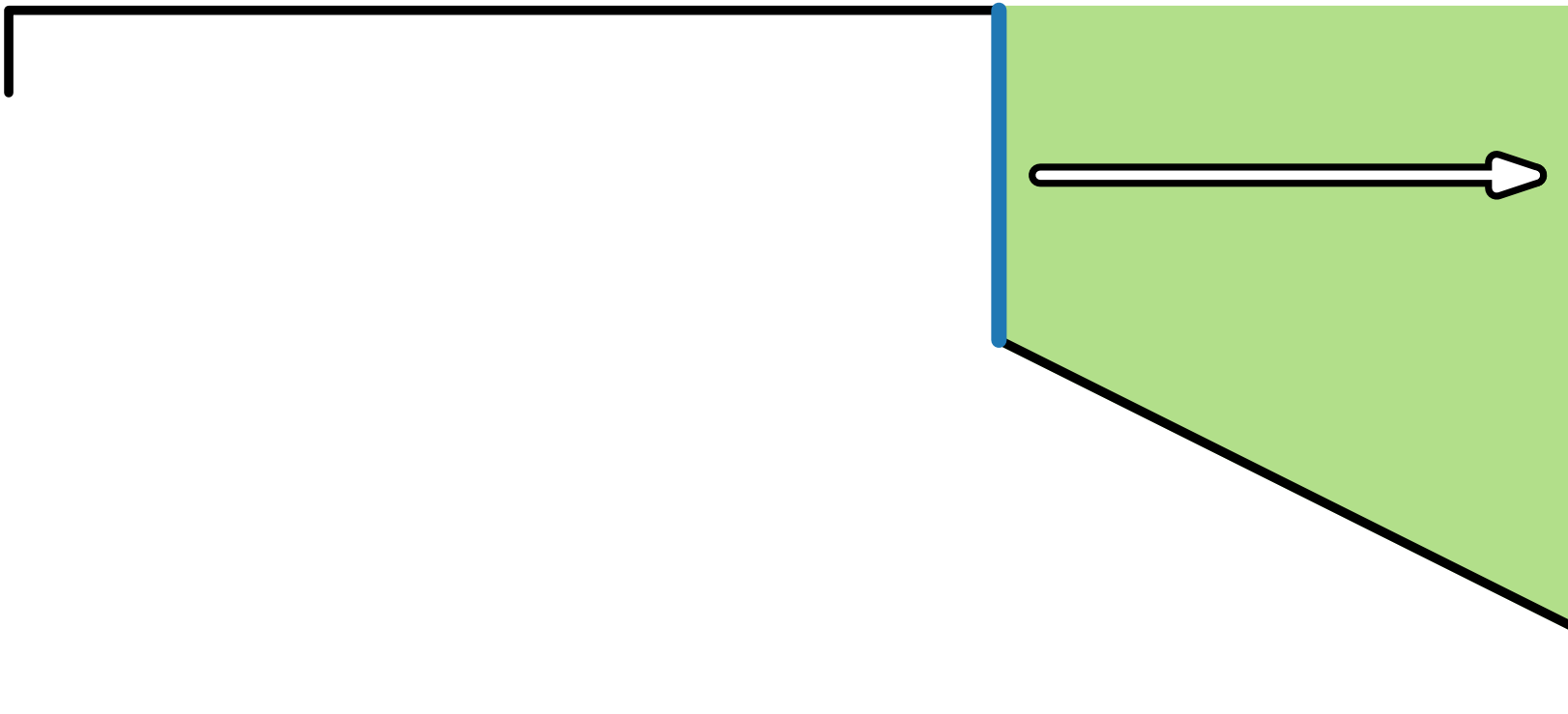


# Edge-moves

3. perform a pair of **edge-moves**

---

Preserves **topology** and **angles**

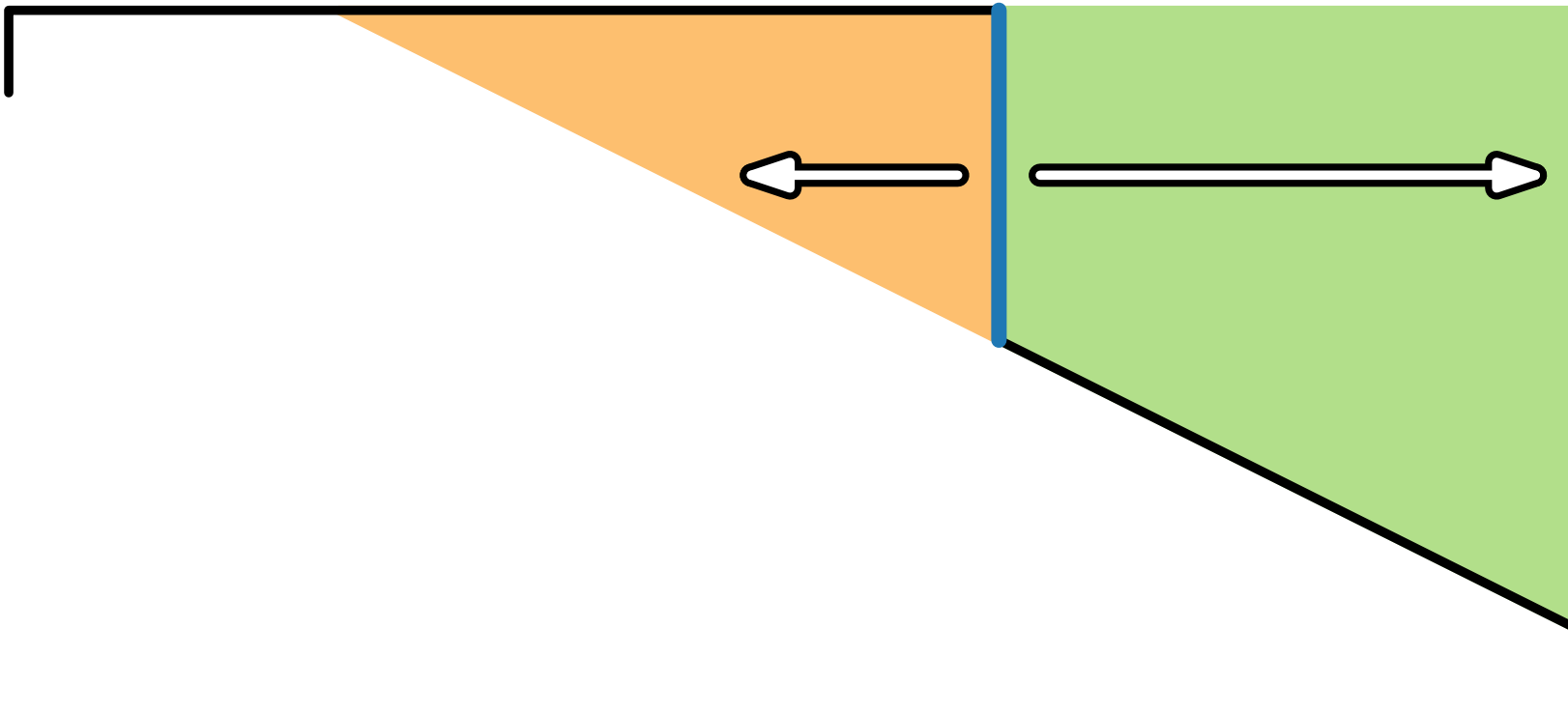


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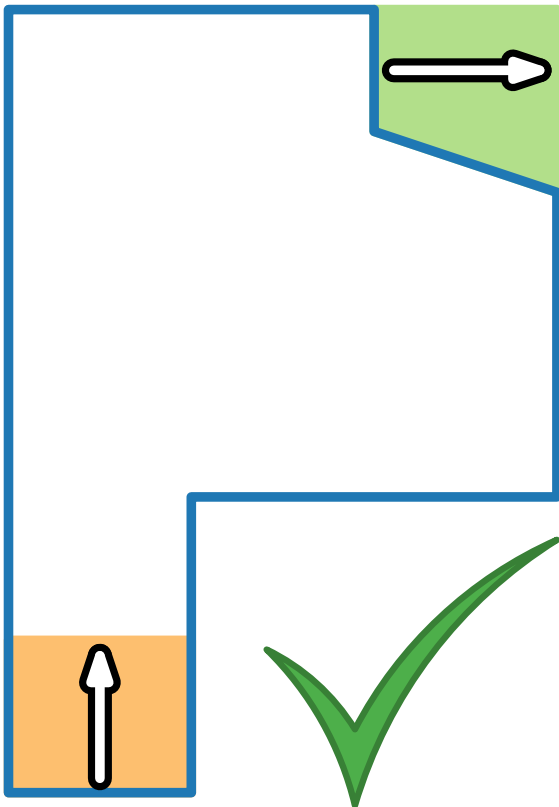


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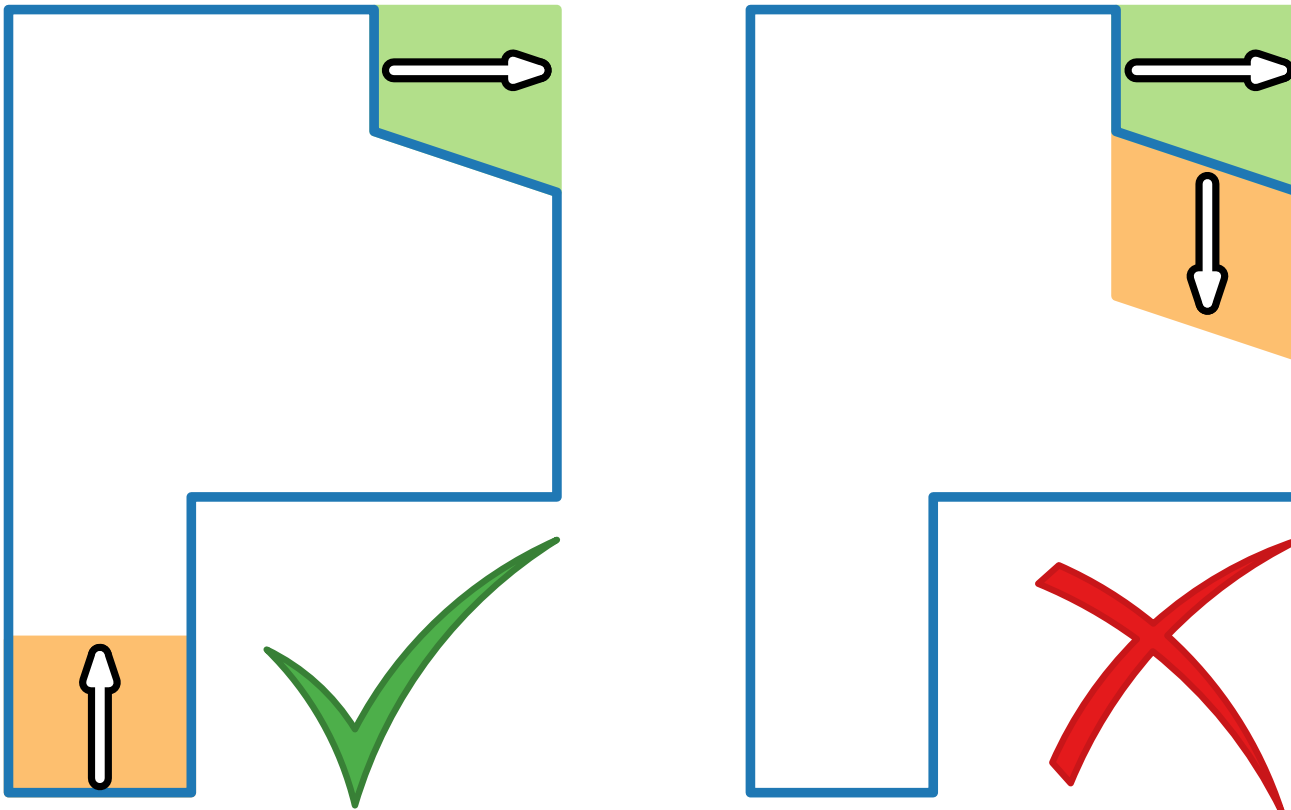
Use pairs to preserve **area**, but avoid conflicts



# Edge-moves

3. perform a pair of **edge-moves**
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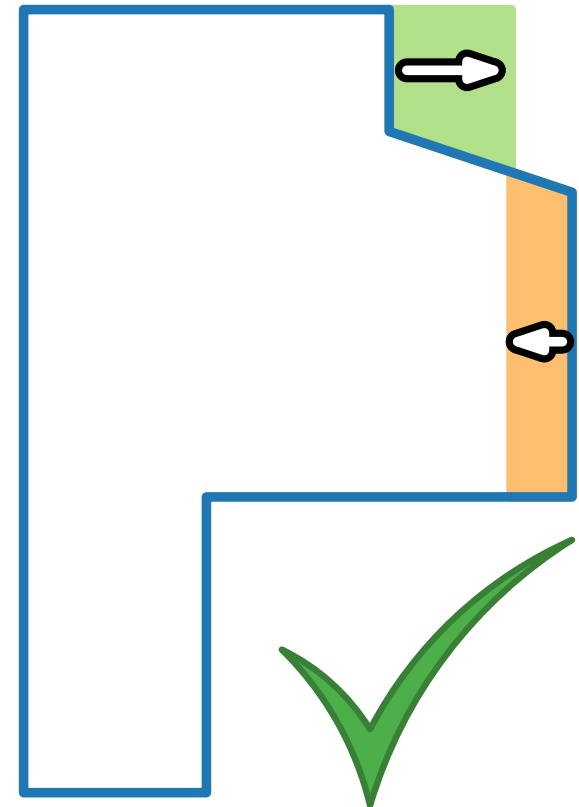
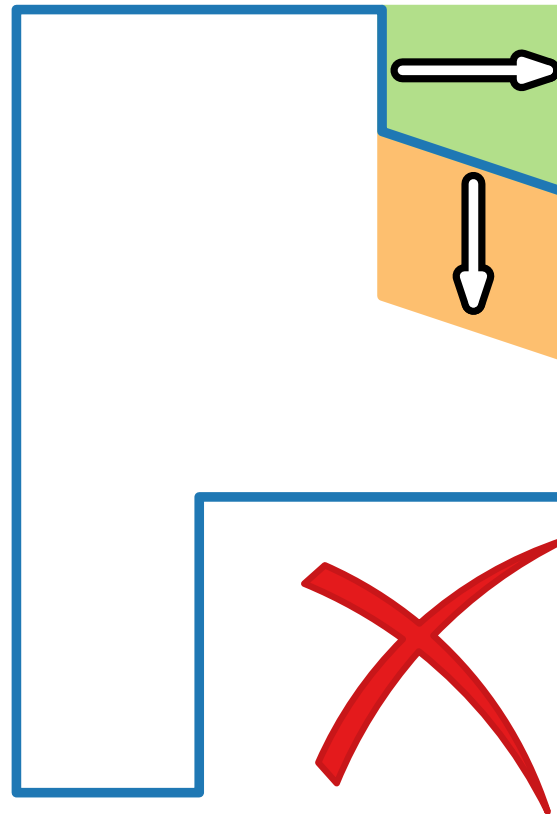
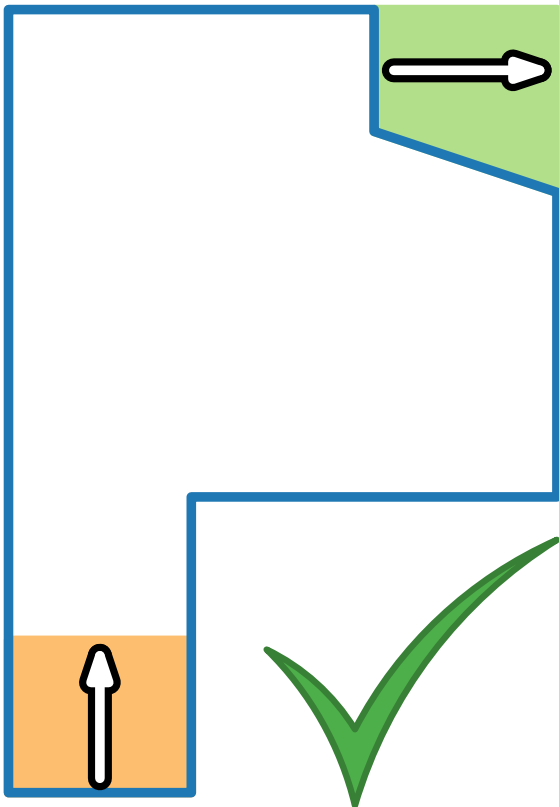




# Edge-moves

3. perform a pair of **edge-moves**
- 

Use pairs to preserve **area**, but avoid conflicts



# Edge-moves

3. perform a pair of **edge-moves**

---

But **which pair** do we pick?

Smallest area (symmetric difference)

Compensate with nearest along boundary

# Termination

4. `until` at most  $k$  lines

---

Can we always reach  $k$ ?

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Can we always reach  $k$ ?

## **Theorem.**

Any nonconvex polygon admits a pair of edge-moves.

$\Rightarrow$  For polygons, we can always reach  $2|C|$

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How fast is the algorithm?

Naive:  $O(n^3)$

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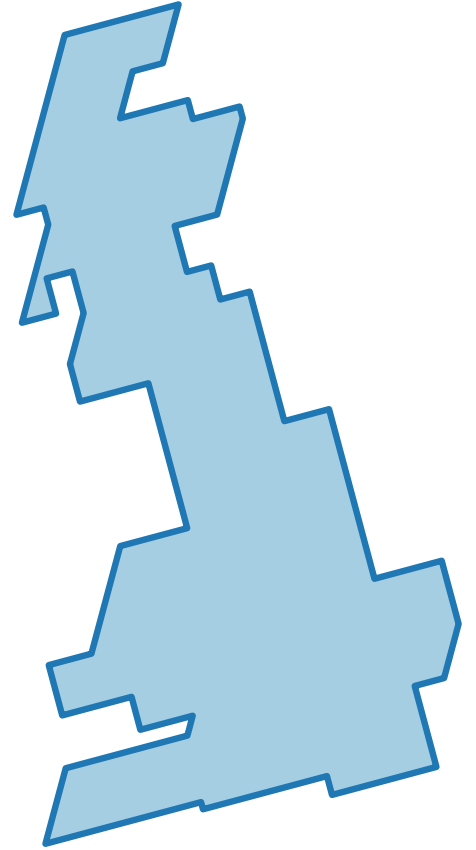
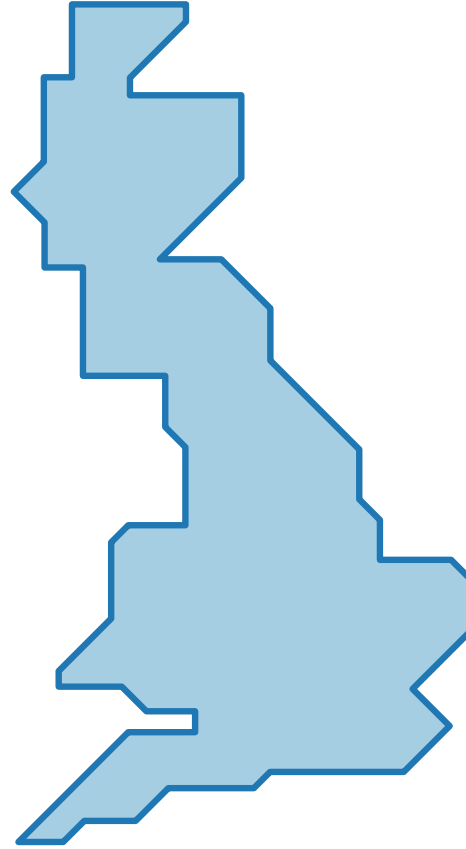
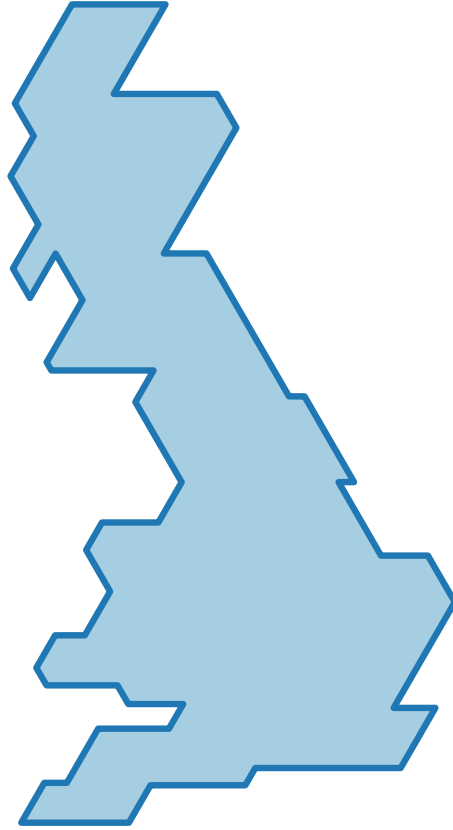
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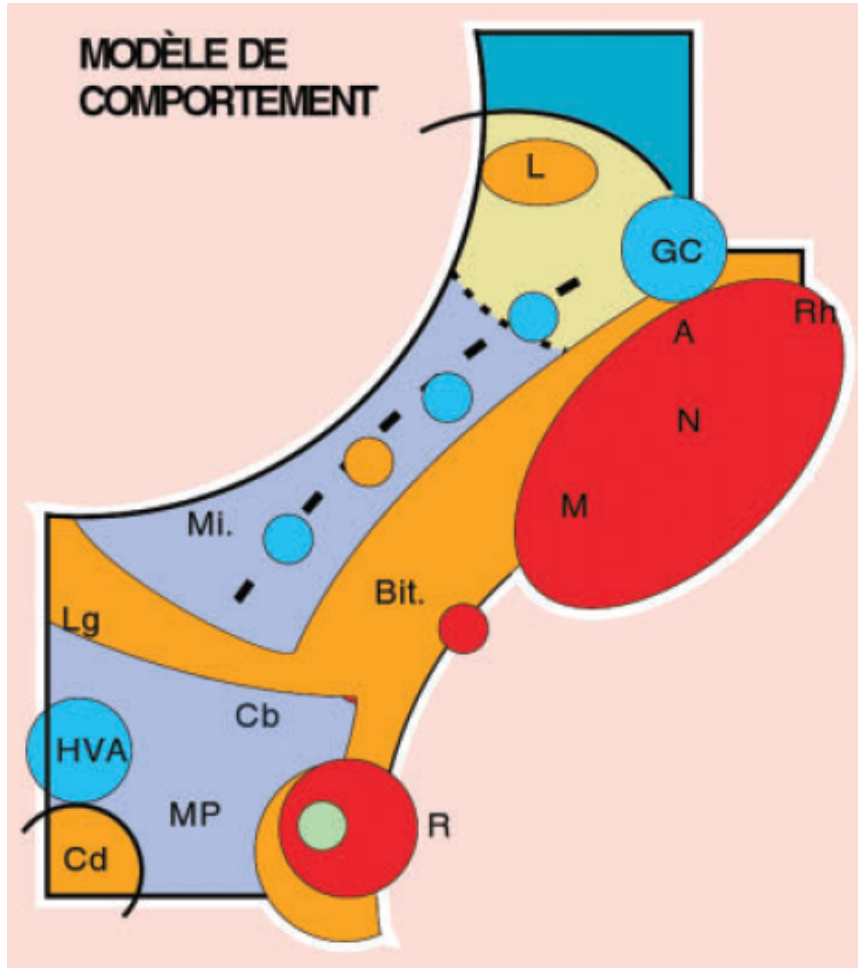
Naive:  $O(n^3)$

Using locality of change:  $O(n^2)$

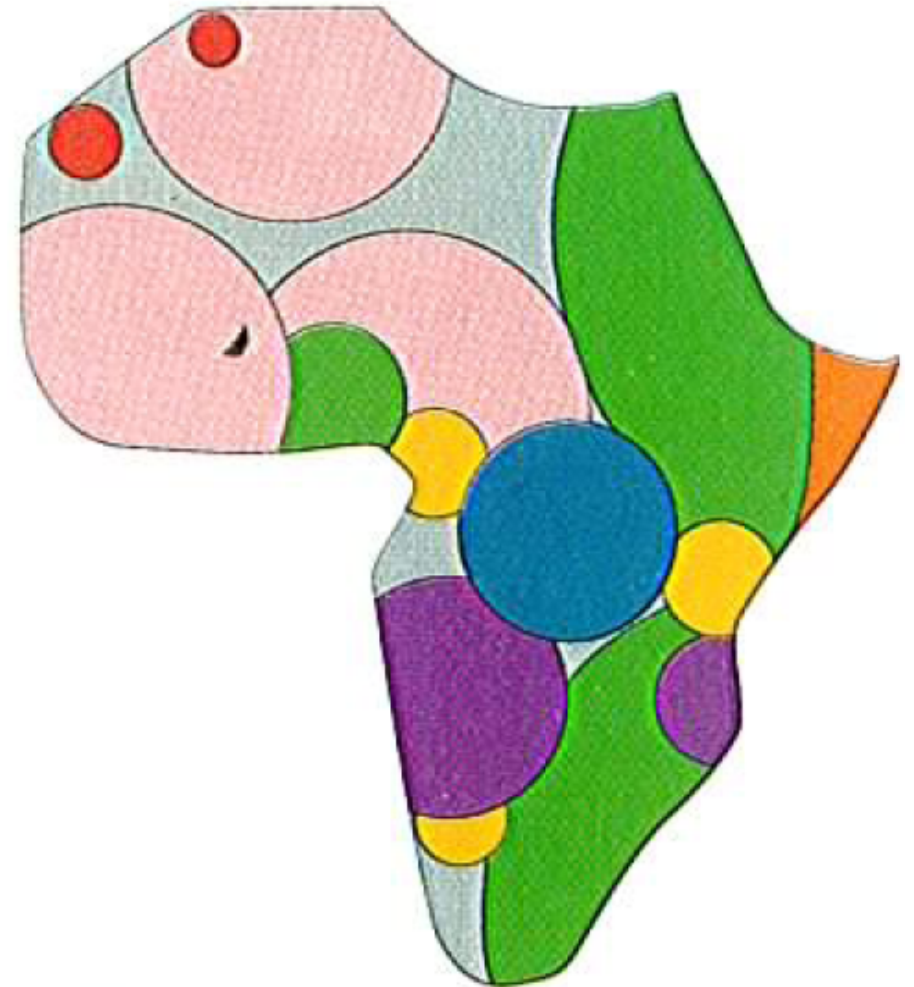
# Schematization styles



# Do we really need lines?



[Brunet, 1991]



[Brunet & Dollfus, 1991]



# Circular arcs

Change edge-moves to **replacements**

Replace sequence of arcs by fewer arcs

Turn lines into arcs

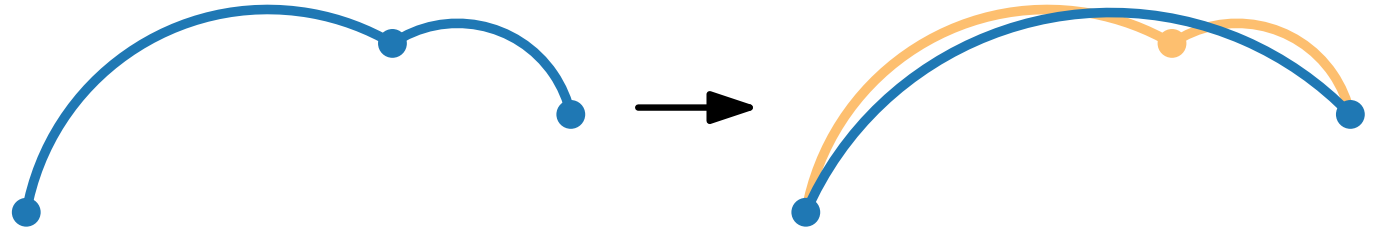
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2-to-1



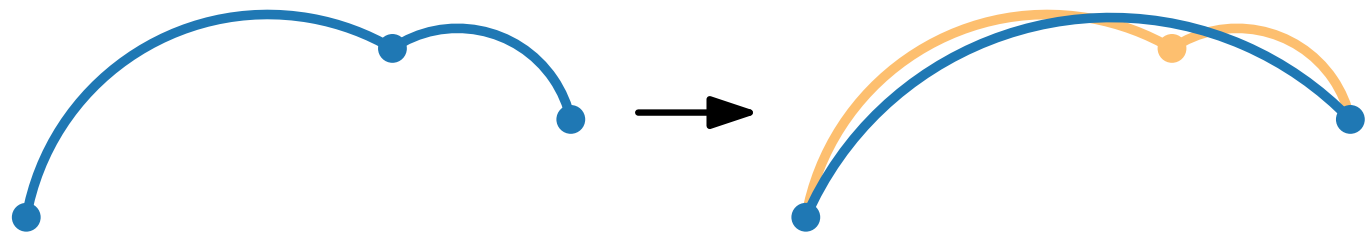
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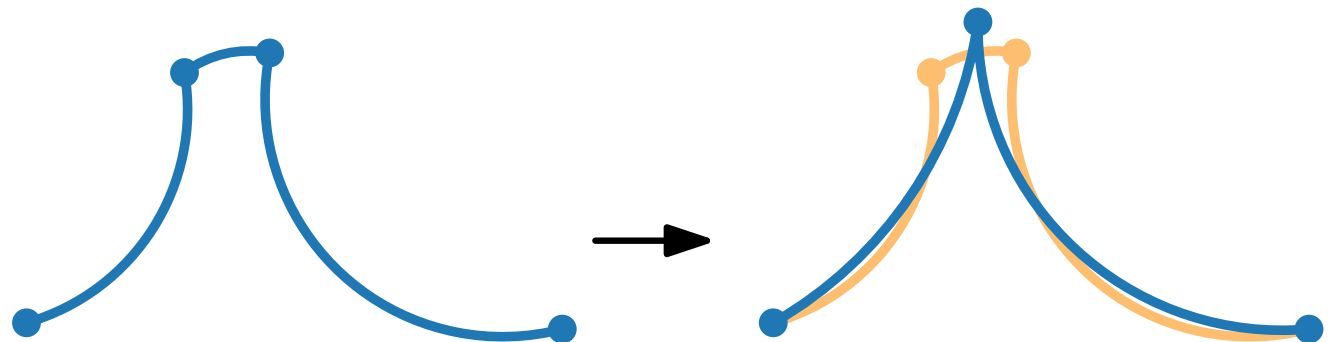
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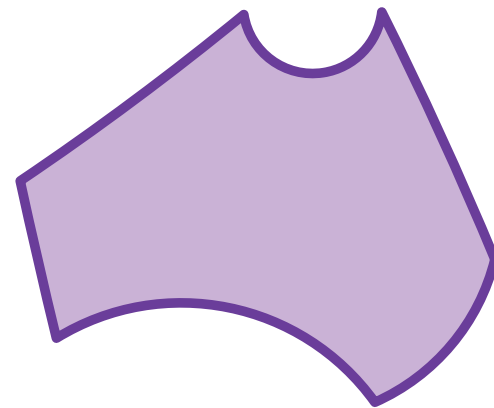
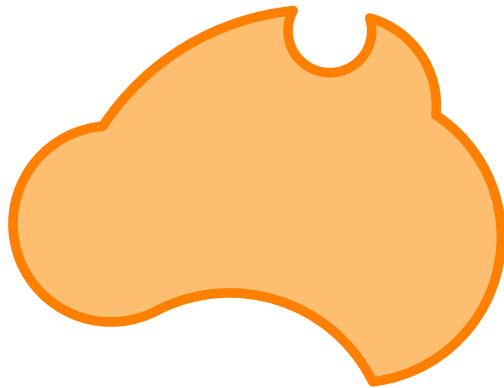


3-to-2



# Curviness

Control **curviness**

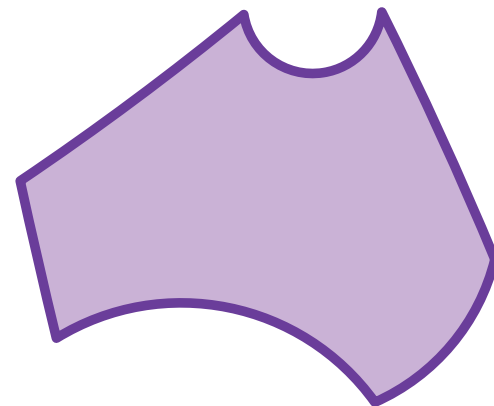


# Curviness

Control **curviness**

Central angle  $\alpha$  as weight

Gives **curved**, **regular** and **flat** style

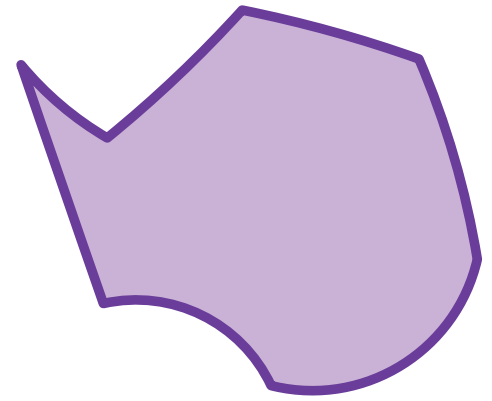
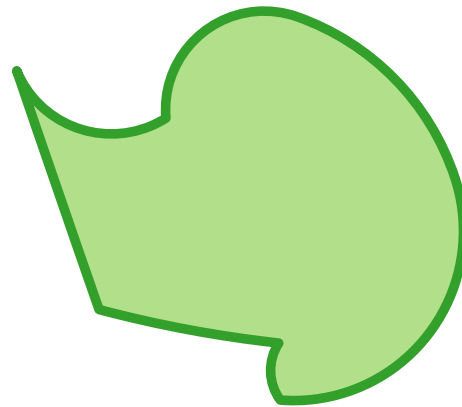
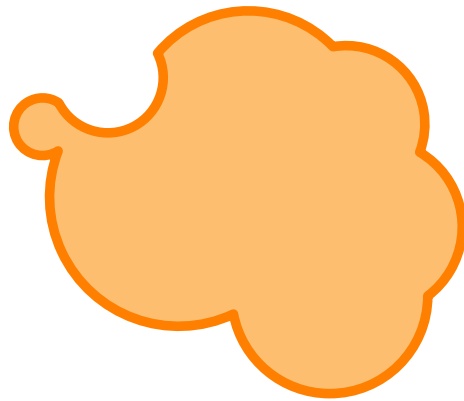


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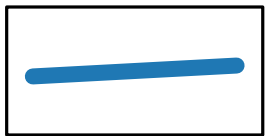
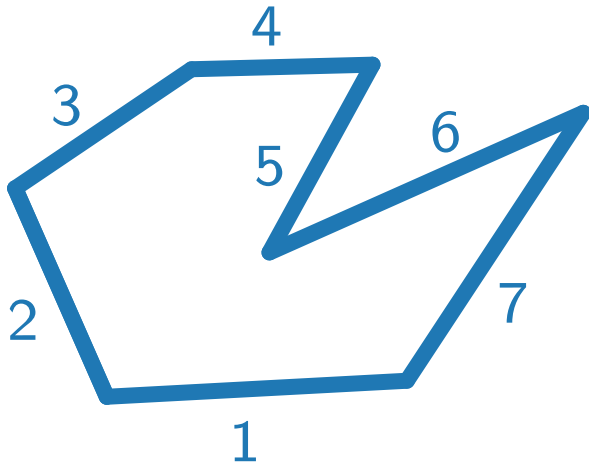
Central angle  $\alpha$  as weight

Gives **curved**, **regular** and **flat** style



# Recovering solutions

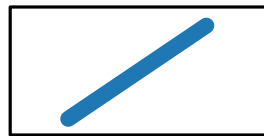
Run once, obtain all solutions



1



2



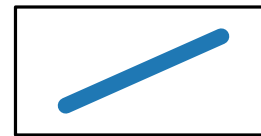
3



4



5



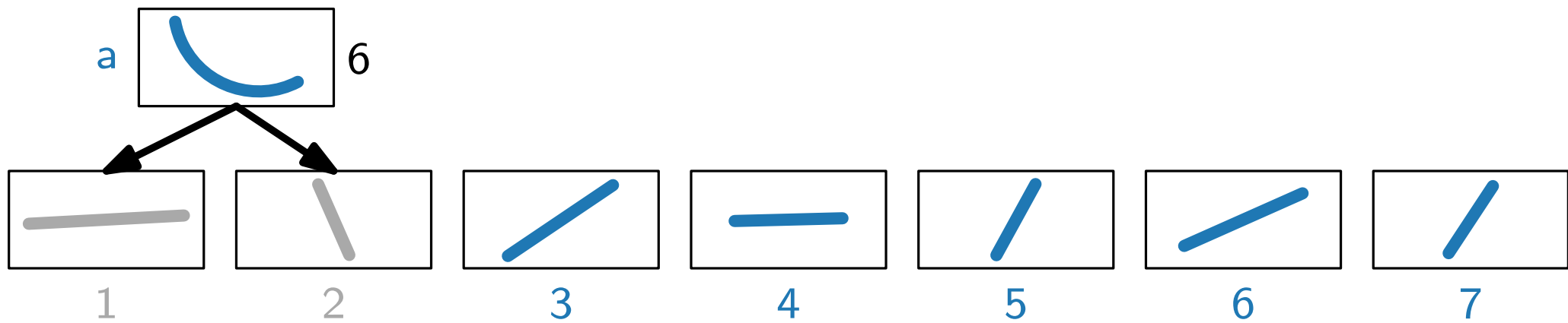
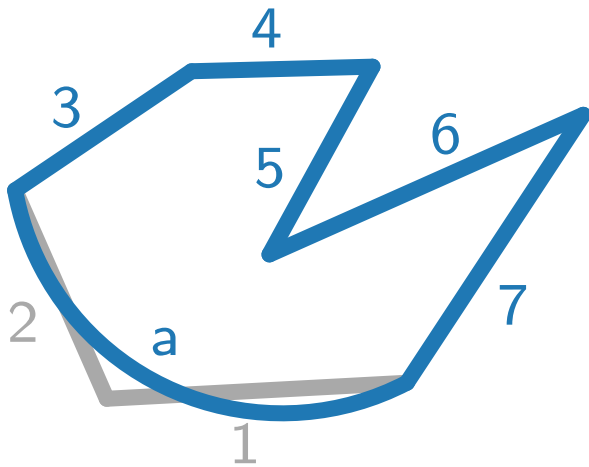
6



7

# Recovering solutions

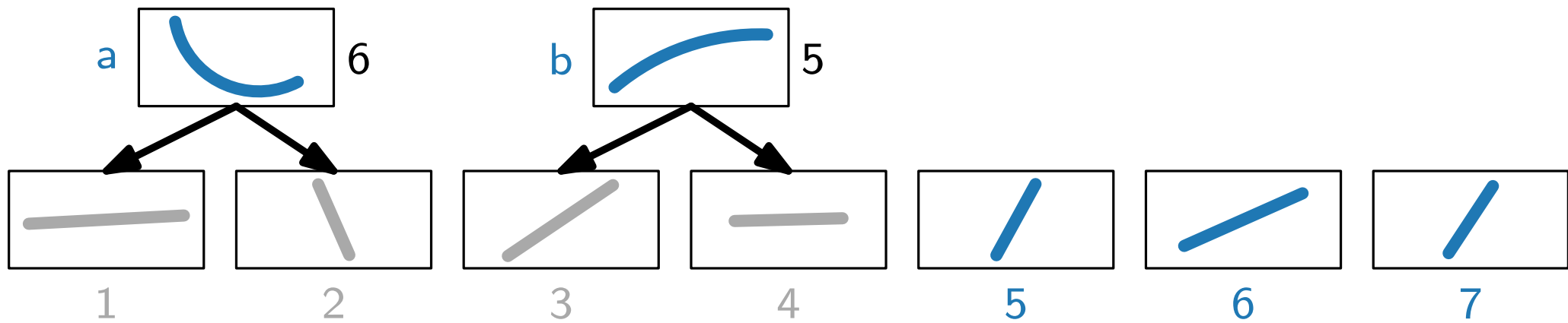
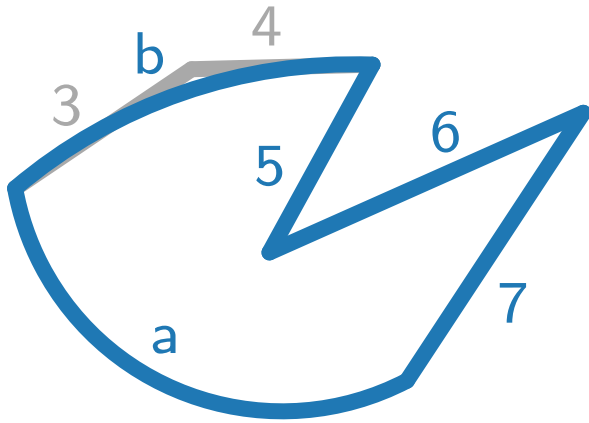
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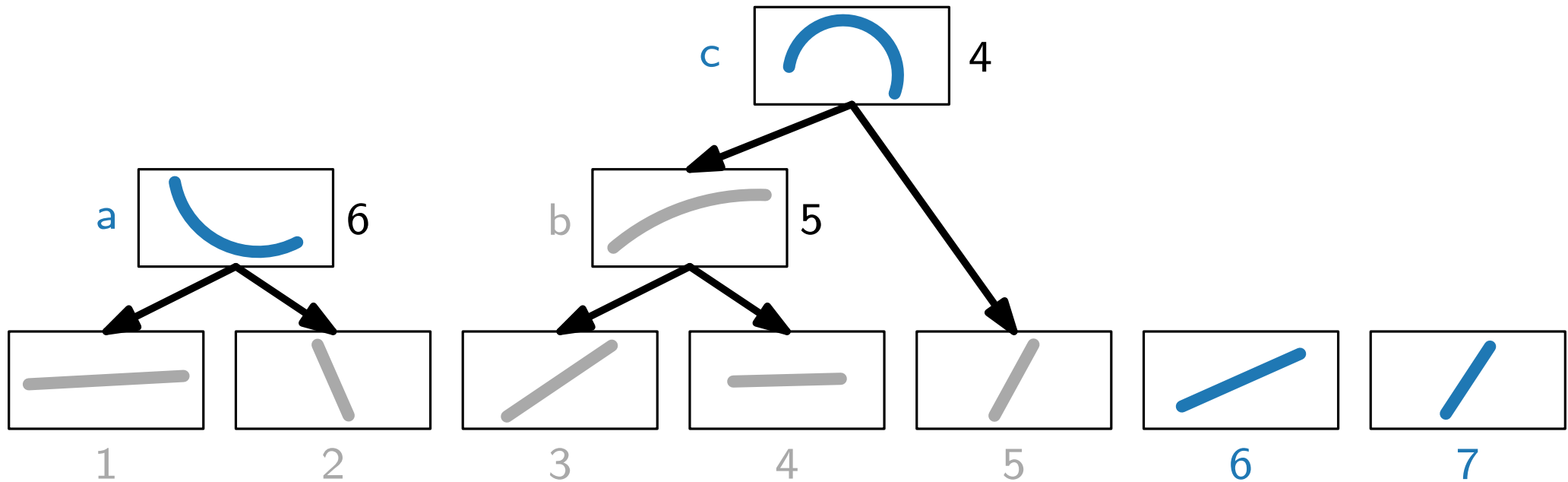
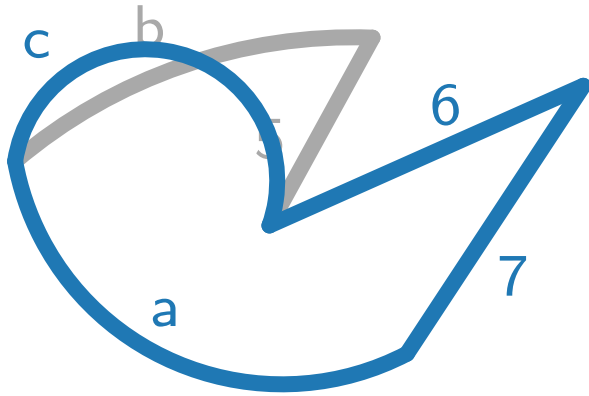
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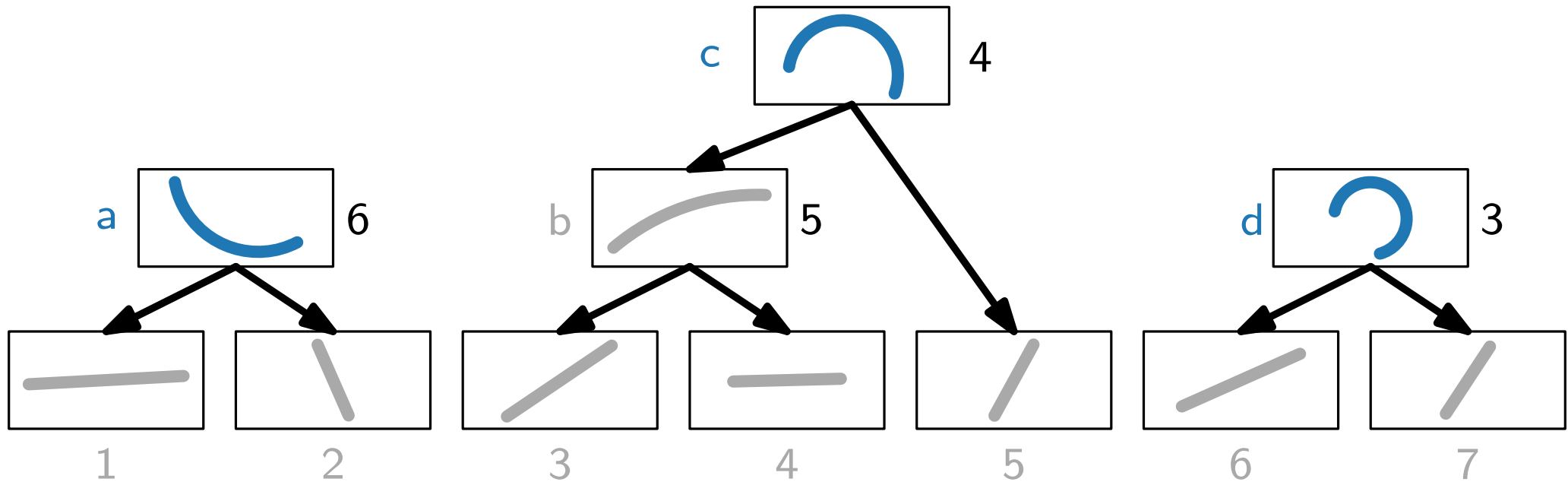
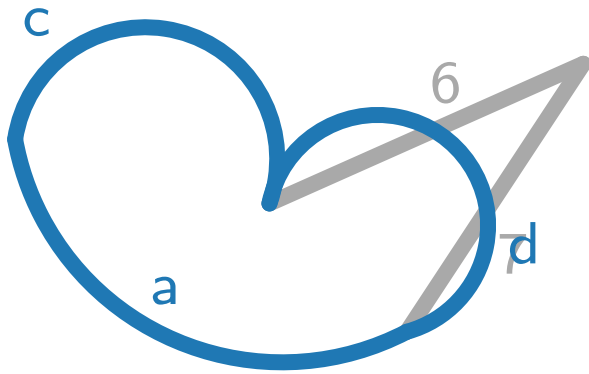
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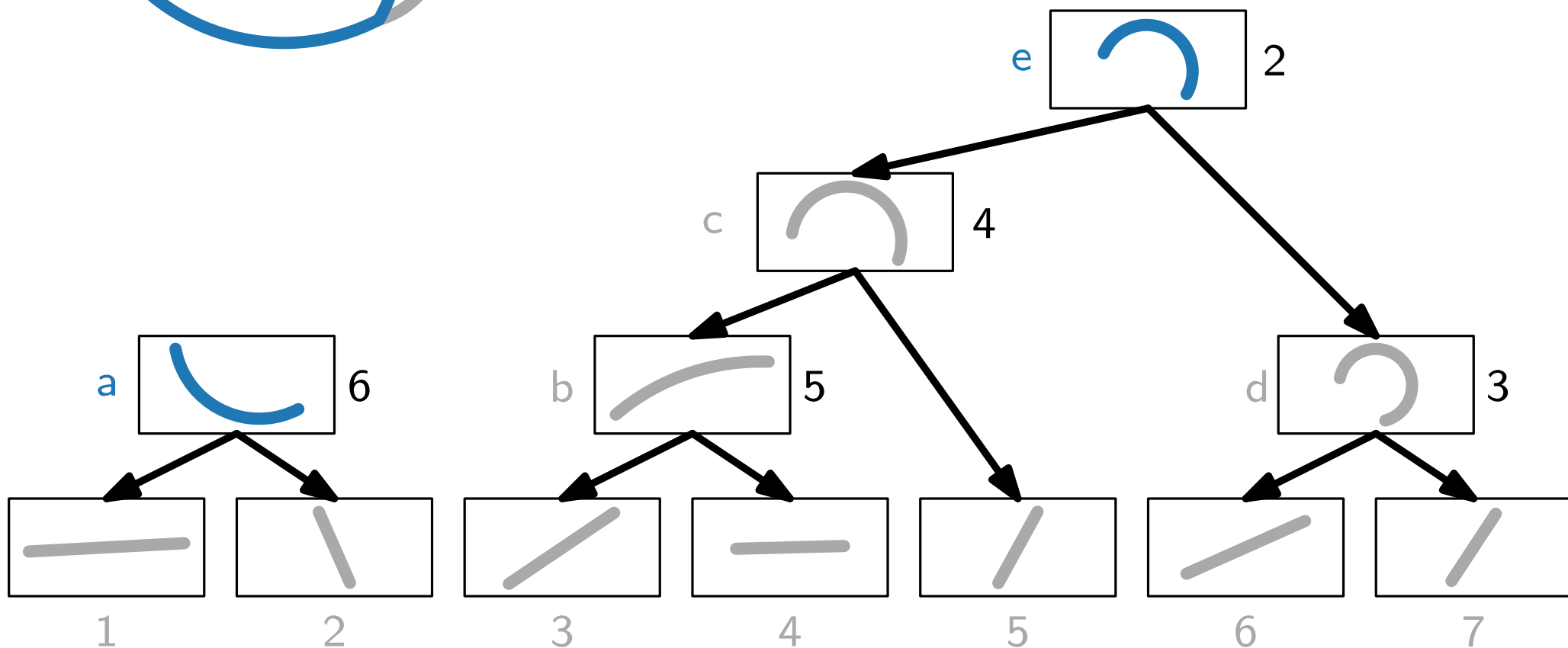
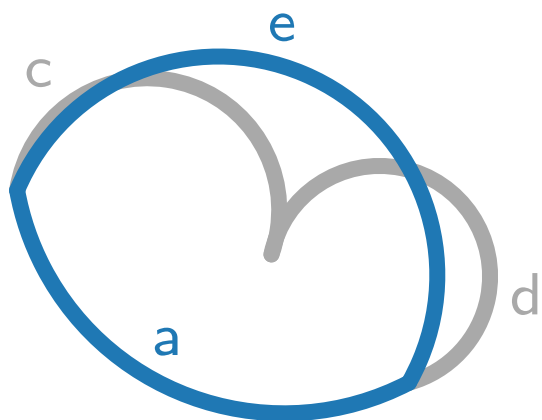
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Run once, obtain all solutions



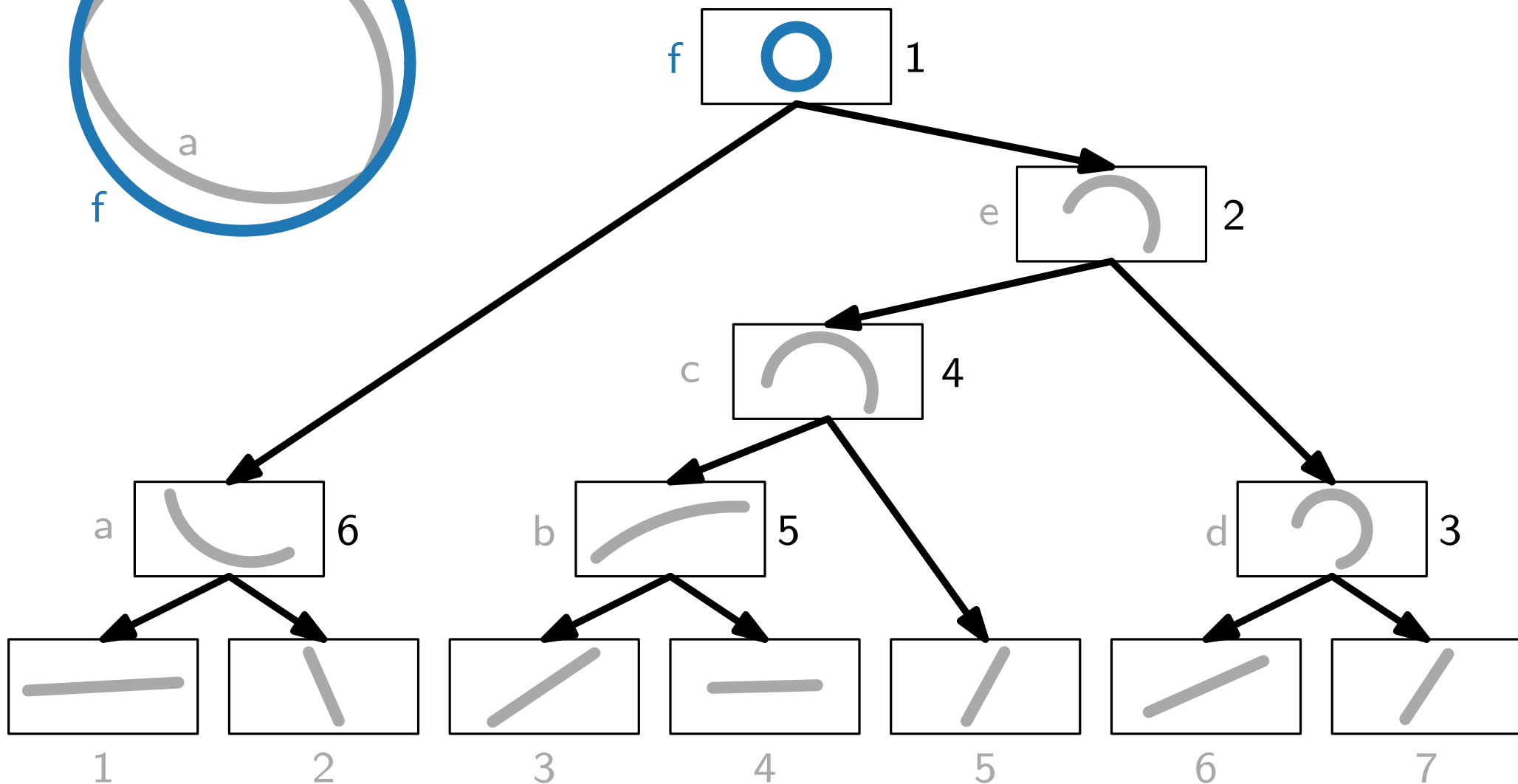
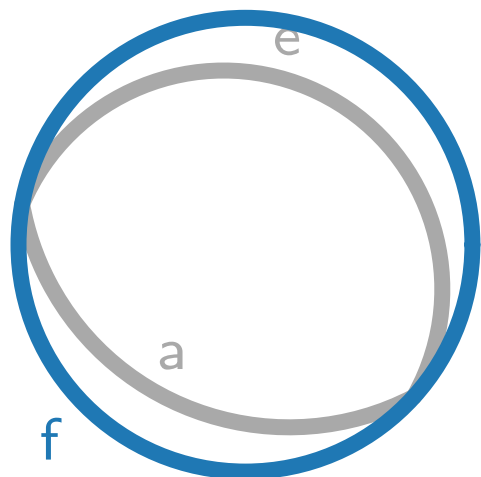
# Recovering solutions

Run once, obtain all solutions



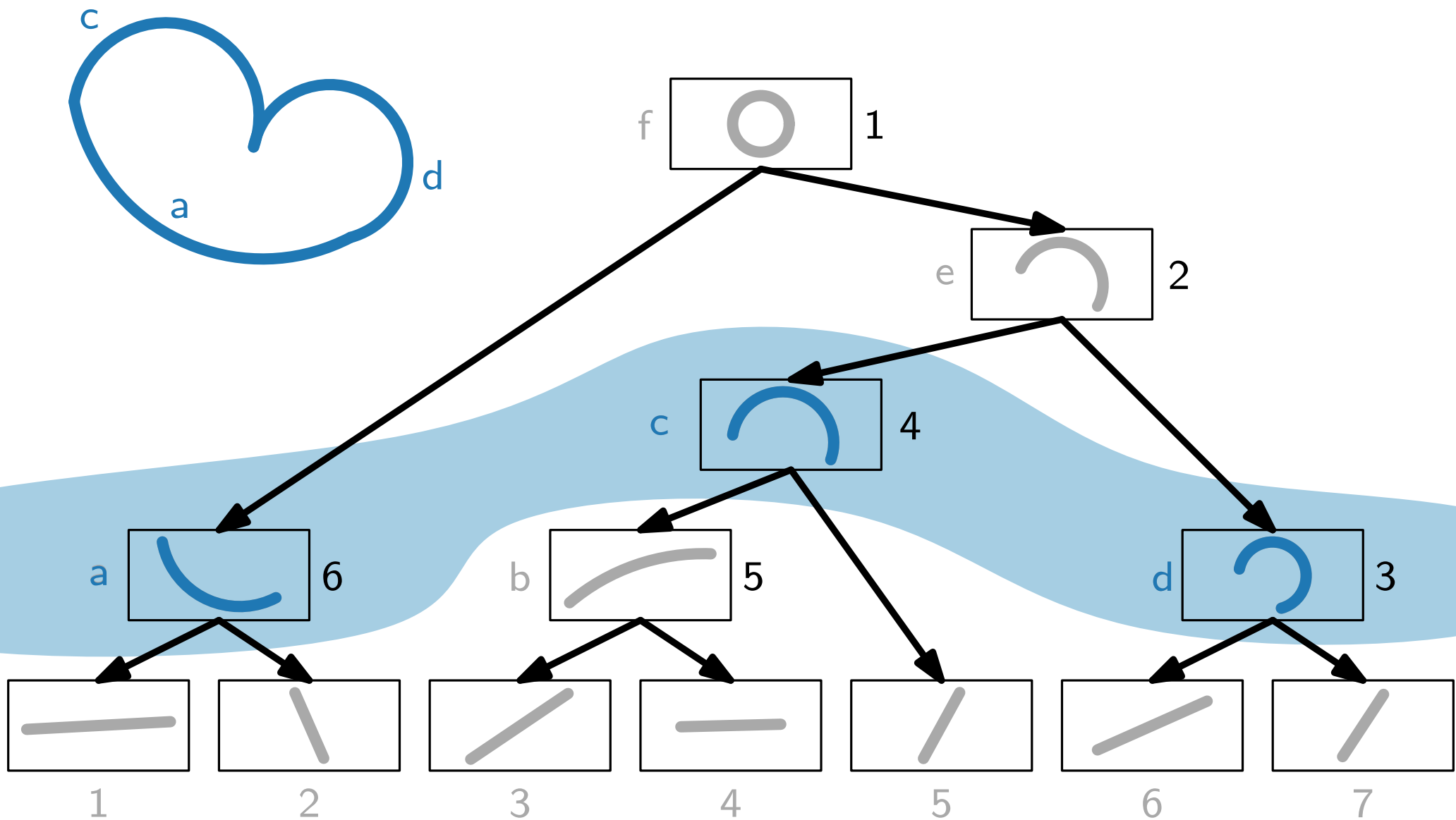
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Run once, obtain all solutions



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Run once, obtain all solutions



# Lines vs arcs

■ Straight   ■ Flat   ■ Regular   ■ Curvy

**Aesthetics**

**Simplicity**

**Recognizability**

# Lines vs arcs

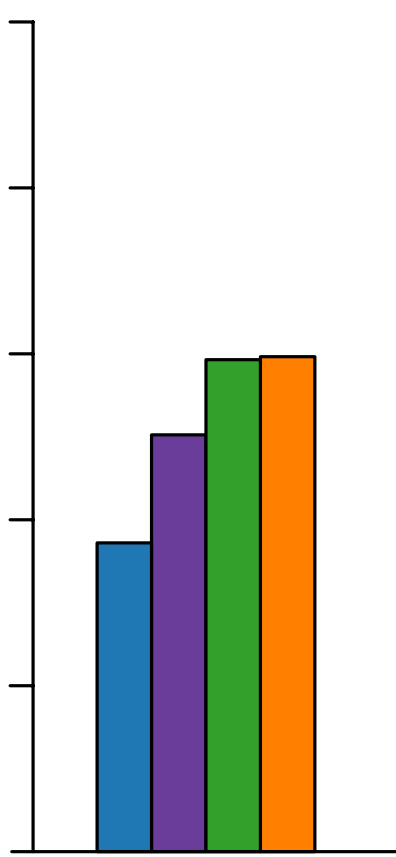
■ Straight   ■ Flat   ■ Regular   ■ Curvy

worth

0.5

0.3

0.1



**Aesthetics**

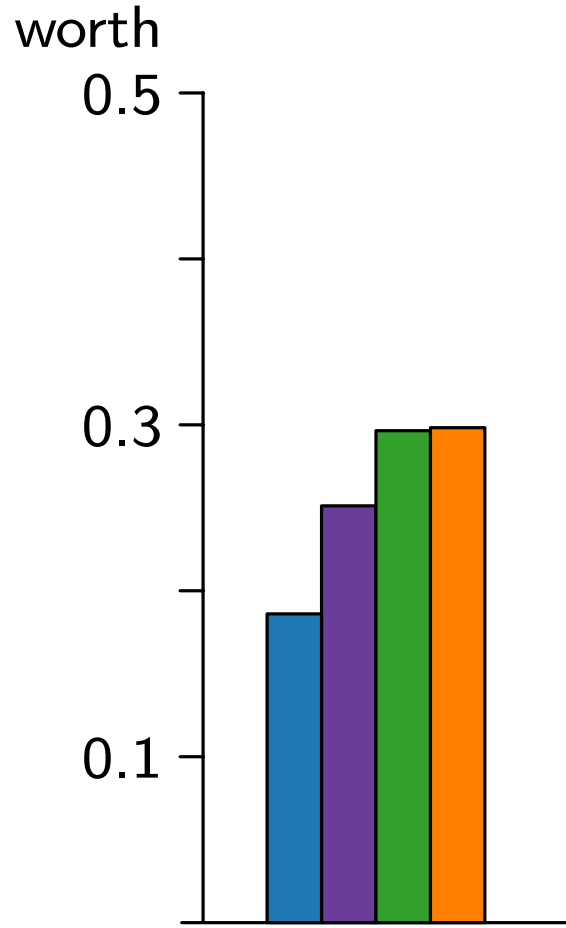
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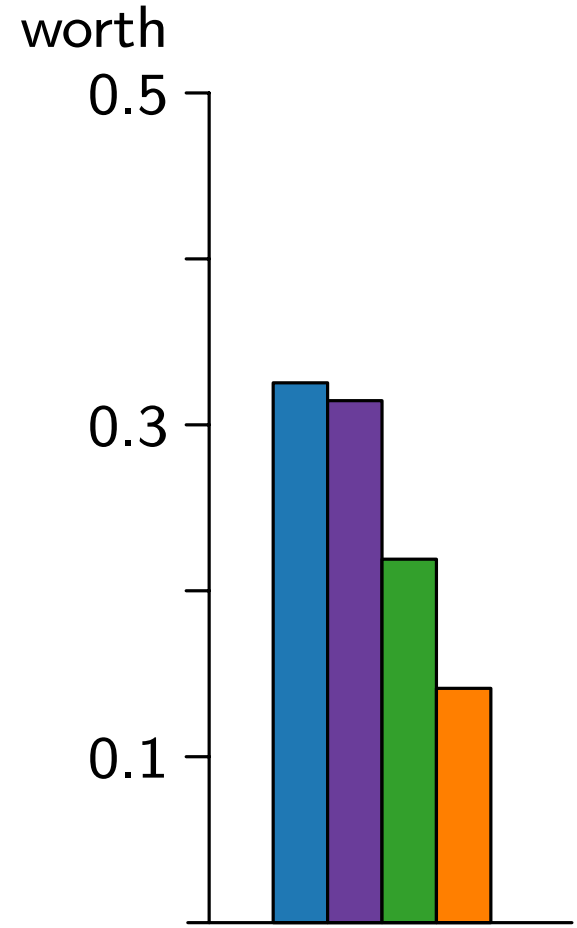


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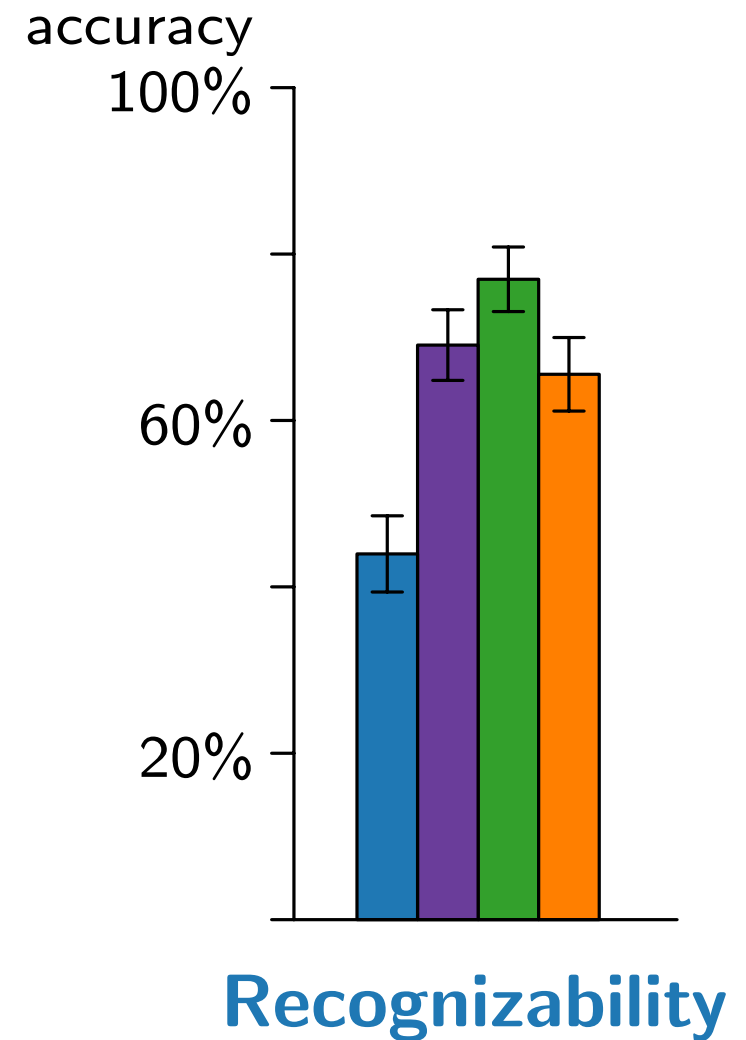
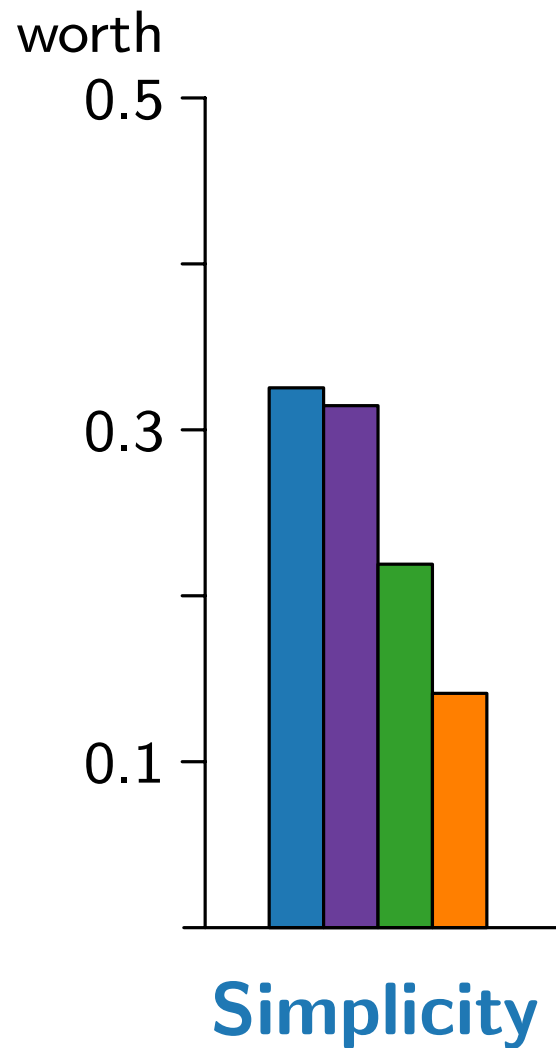
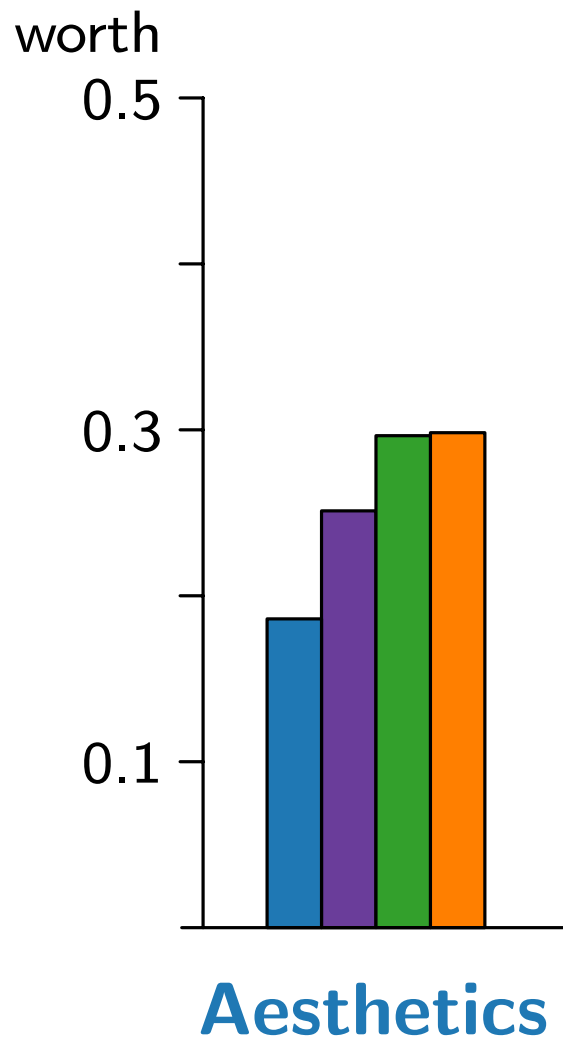


**Simplicity**

**Recognizability**

# Lines vs arcs

■ Straight ■ Flat ■ Regular ■ Curvy



# “Nongeographic” schematization

What happens if we get rid of all geography?

## Problem.

Draw a graph  $G$  with **low complexity**

# Graph complexity

Complexity of a graph  $G = (V, E)$

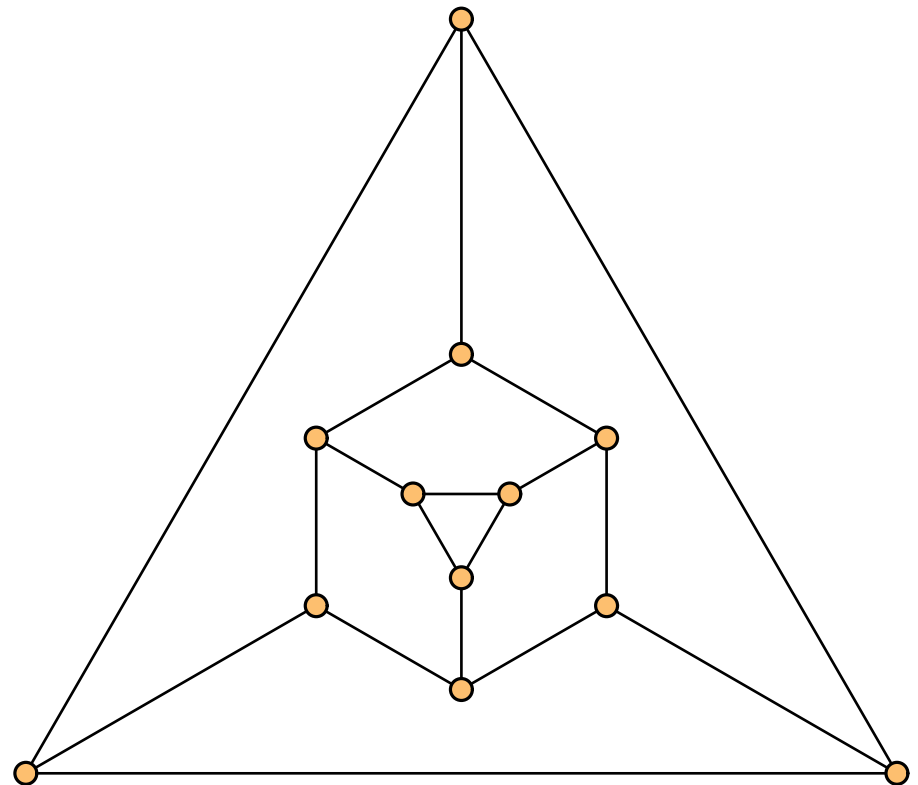
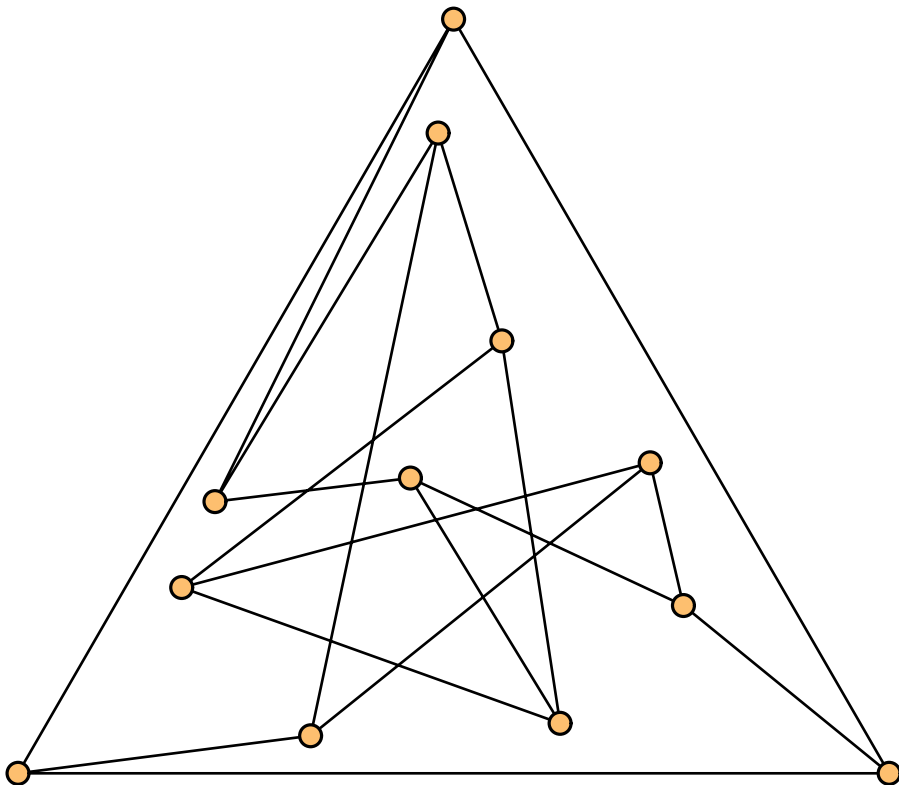
Usually  $|V|$ ,  $|E|$ , etc.

# Graph complexity

Complexity of a graph  $G = (V, E)$

Usually  $|V|$ ,  $|E|$ , etc.

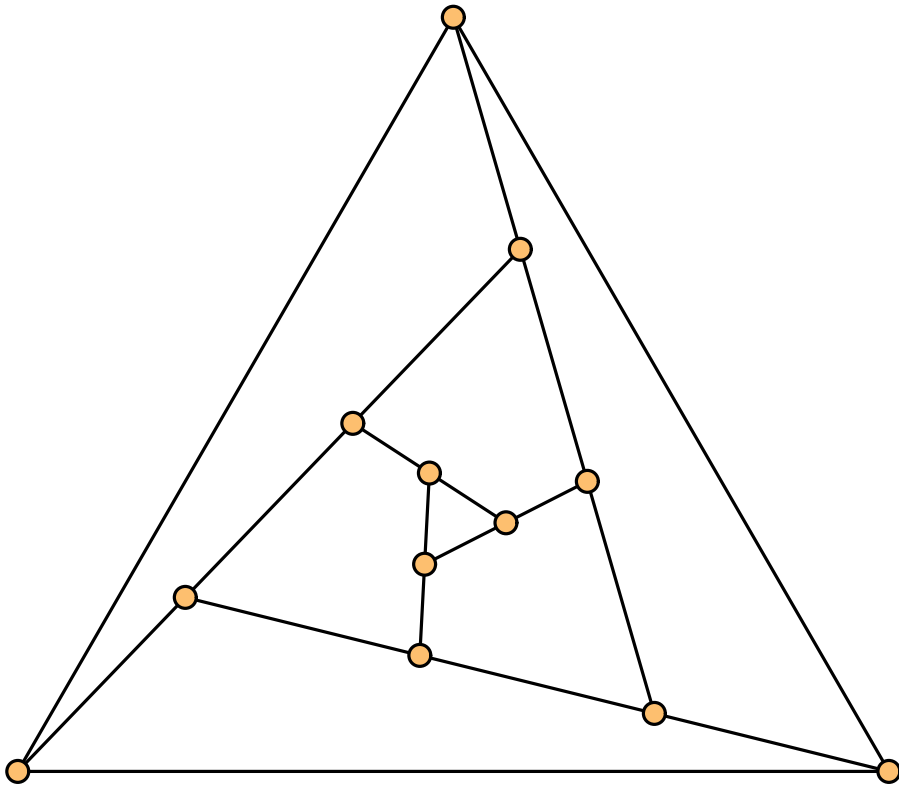
**Says nothing about how complex a drawing is**



# Visual complexity

Planar graphs

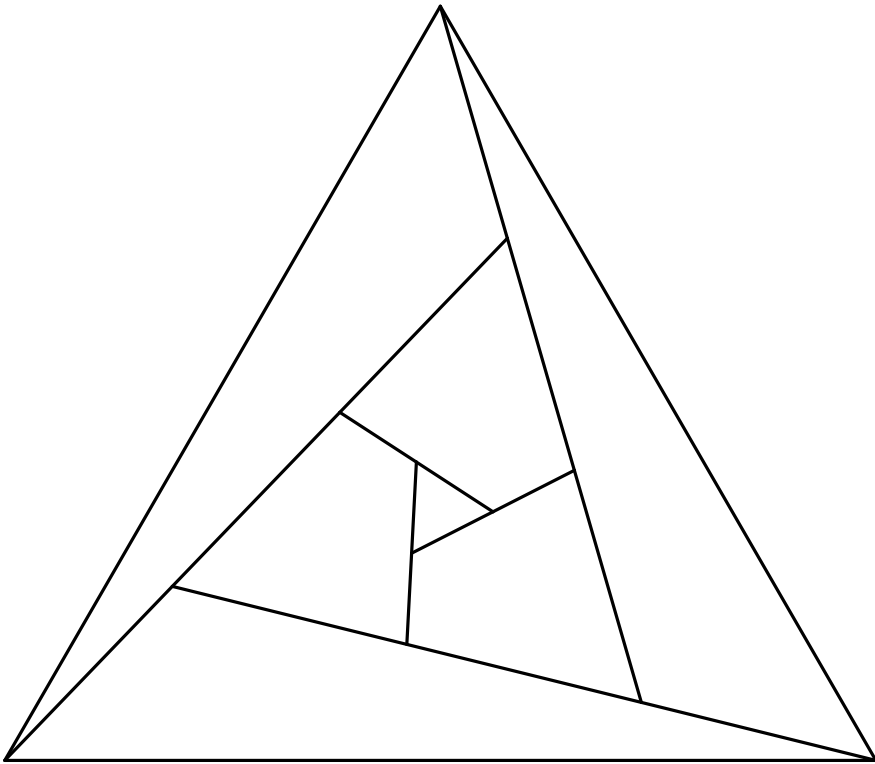
Number of **geometric objects** for drawing



# Visual complexity

Planar graphs

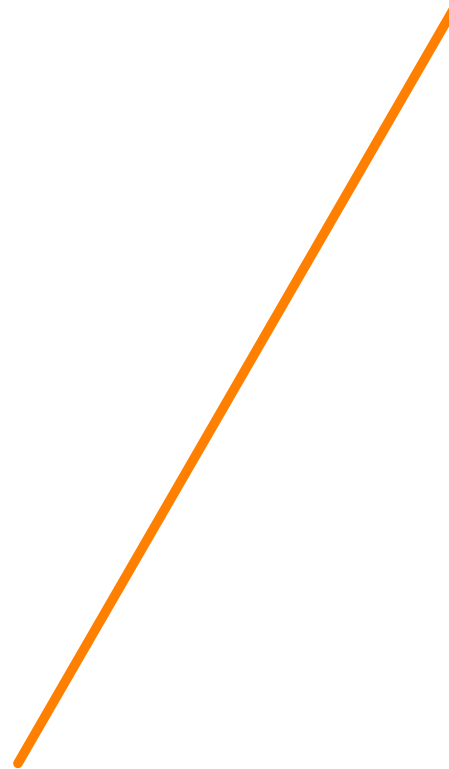
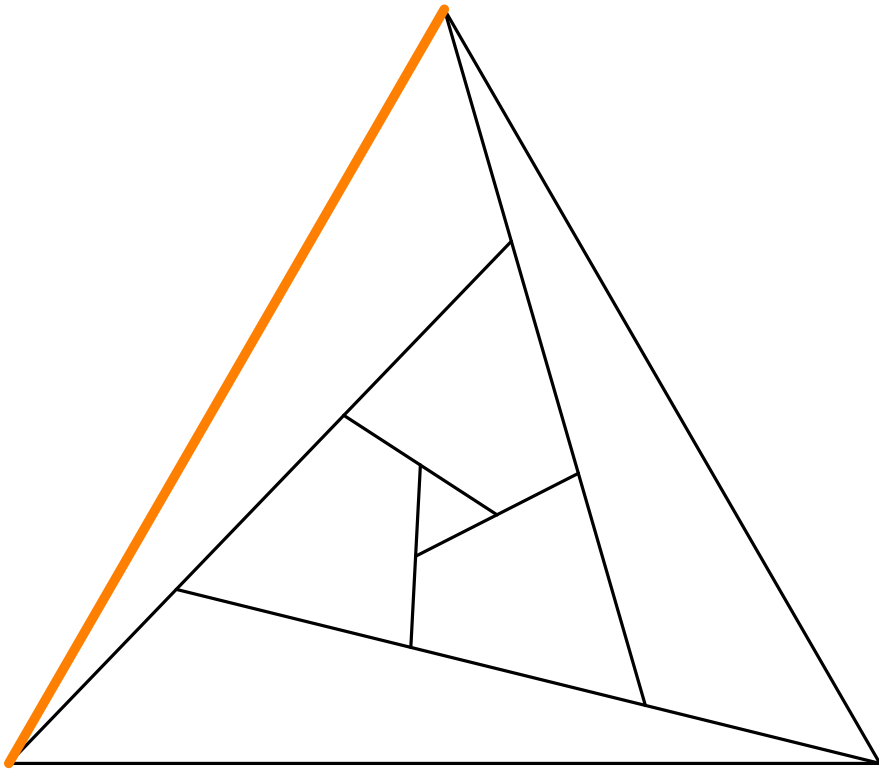
Number of **geometric objects** for drawing



# Visual complexity

Planar graphs

Number of **geometric objects** for drawing



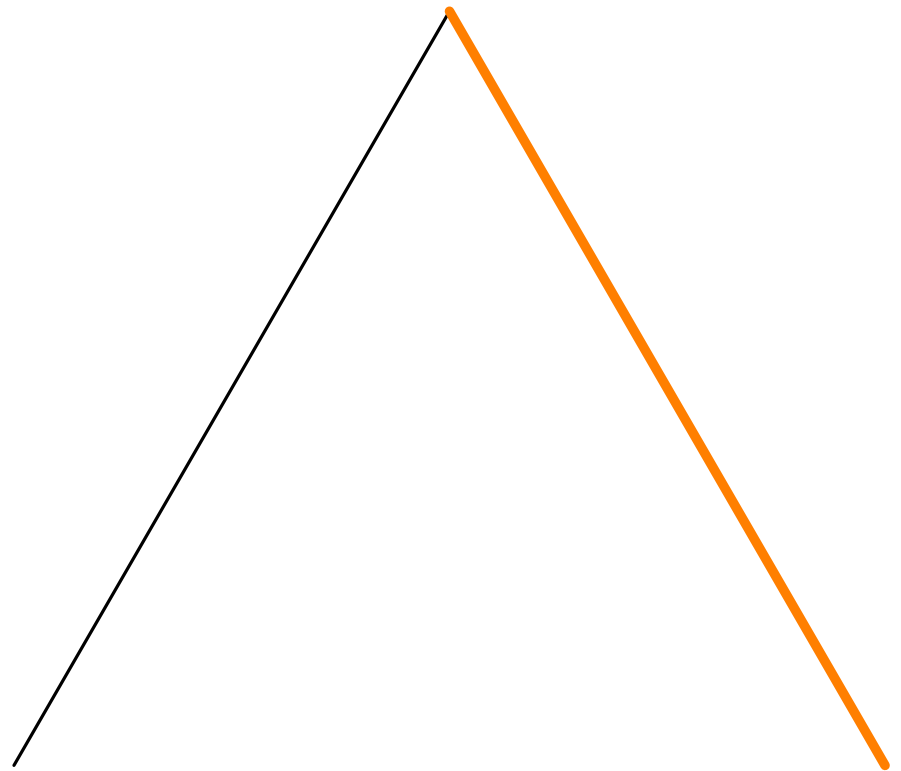
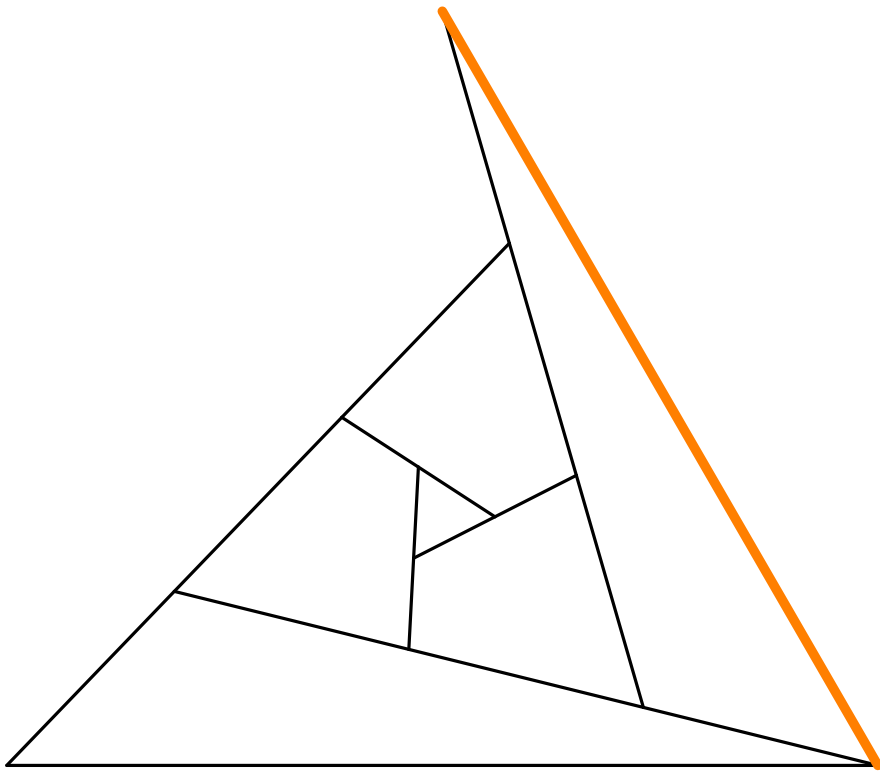
1



# Visual complexity

Planar graphs

Number of **geometric objects** for drawing

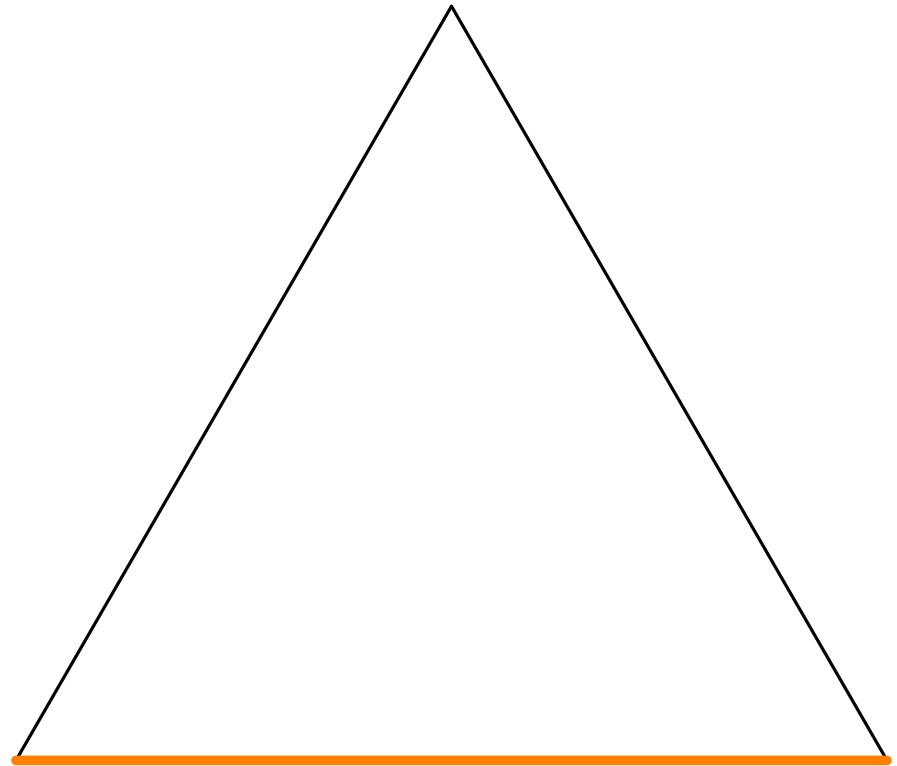
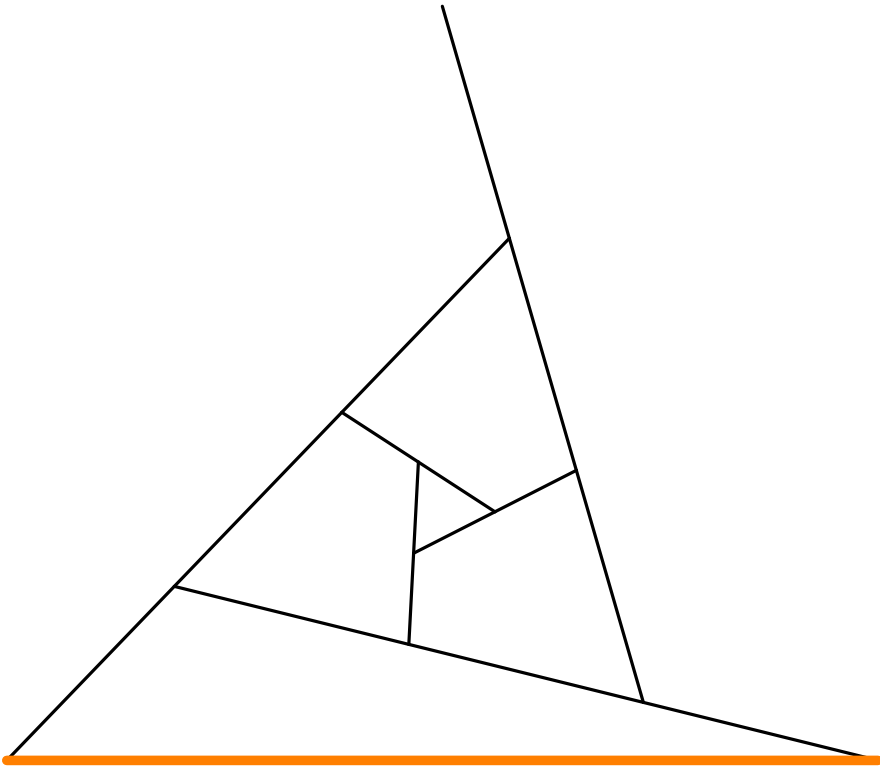


2

# Visual complexity

Planar graphs

Number of **geometric objects** for drawing

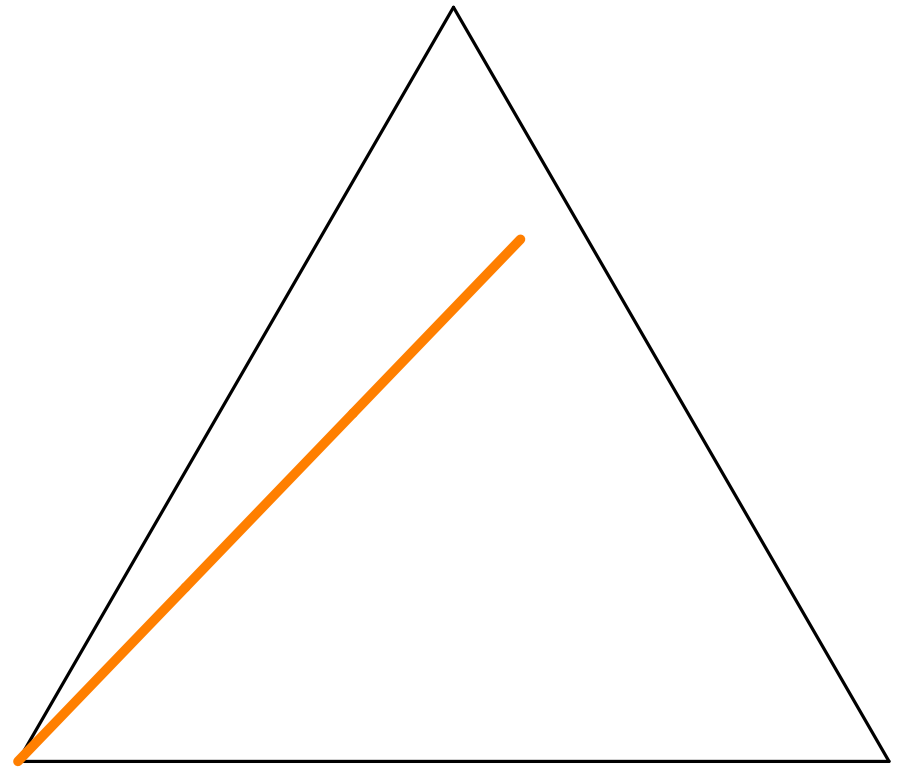
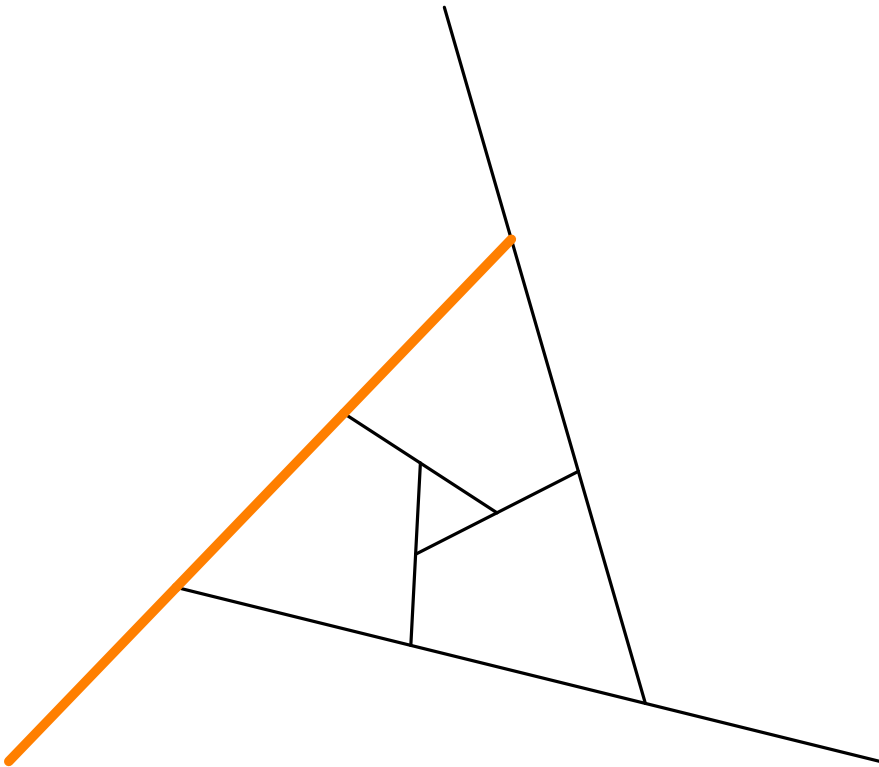


3

# Visual complexity

Planar graphs

Number of **geometric objects** for drawing

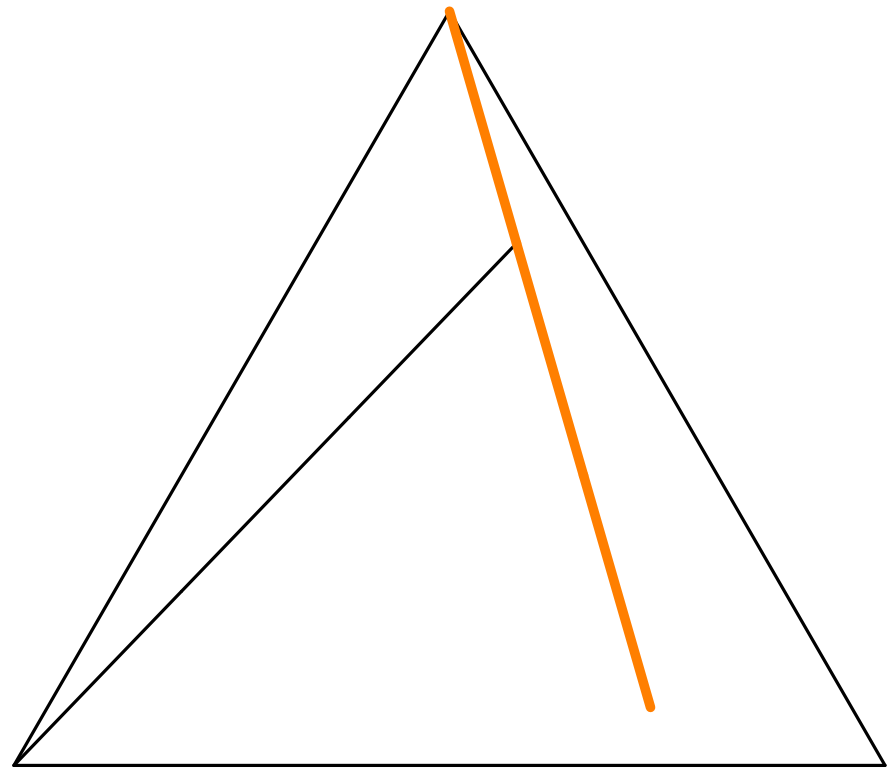
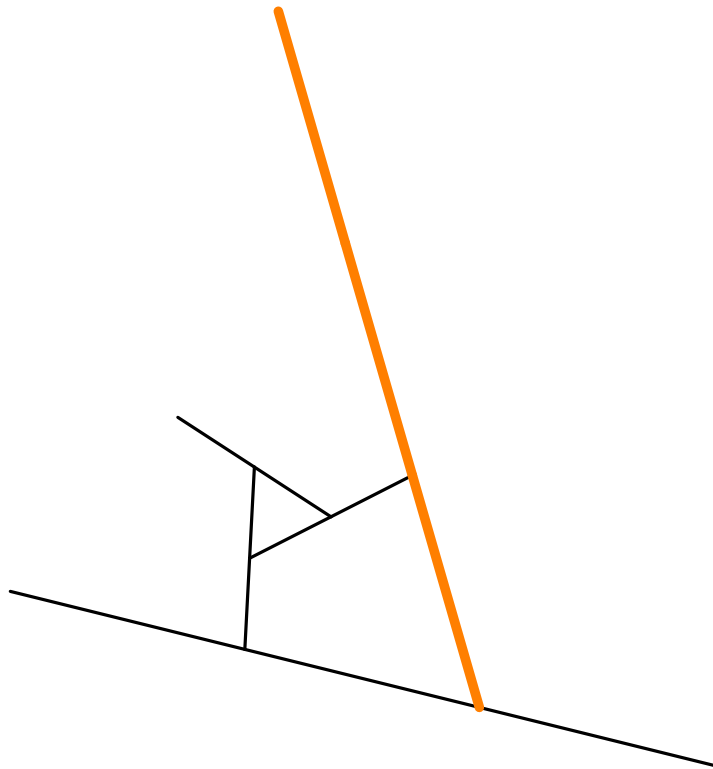


4

# Visual complexity

Planar graphs

Number of **geometric objects** for drawing

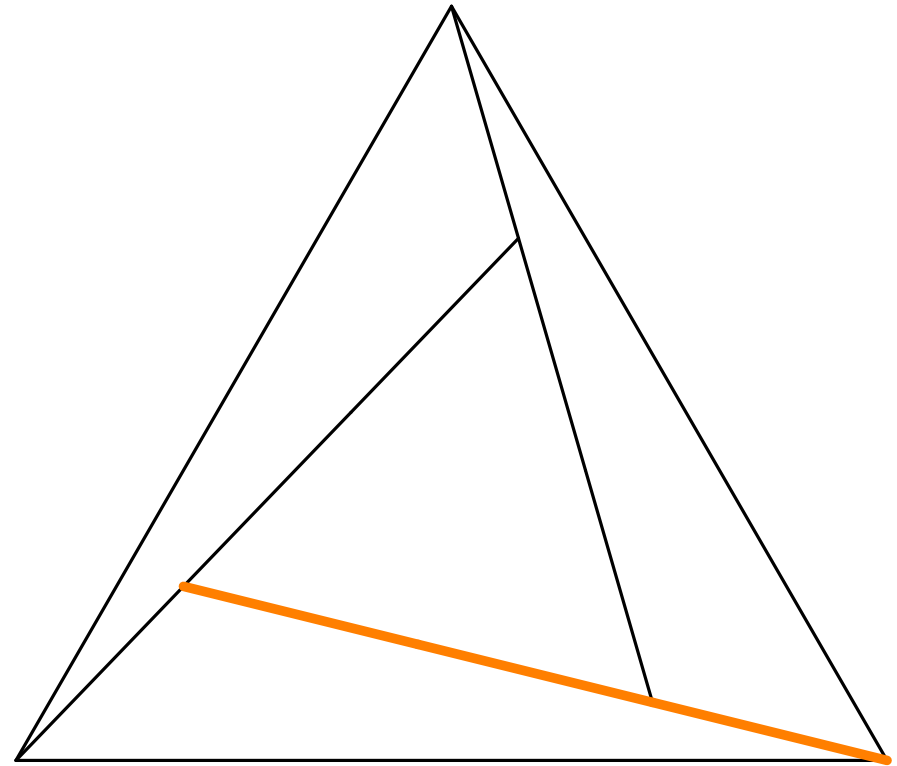
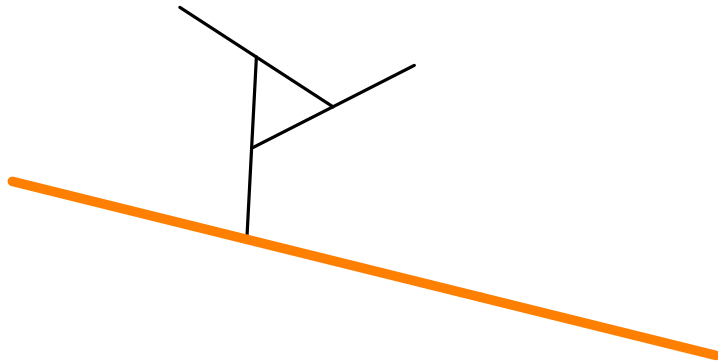


5

# Visual complexity

Planar graphs

Number of **geometric objects** for drawing

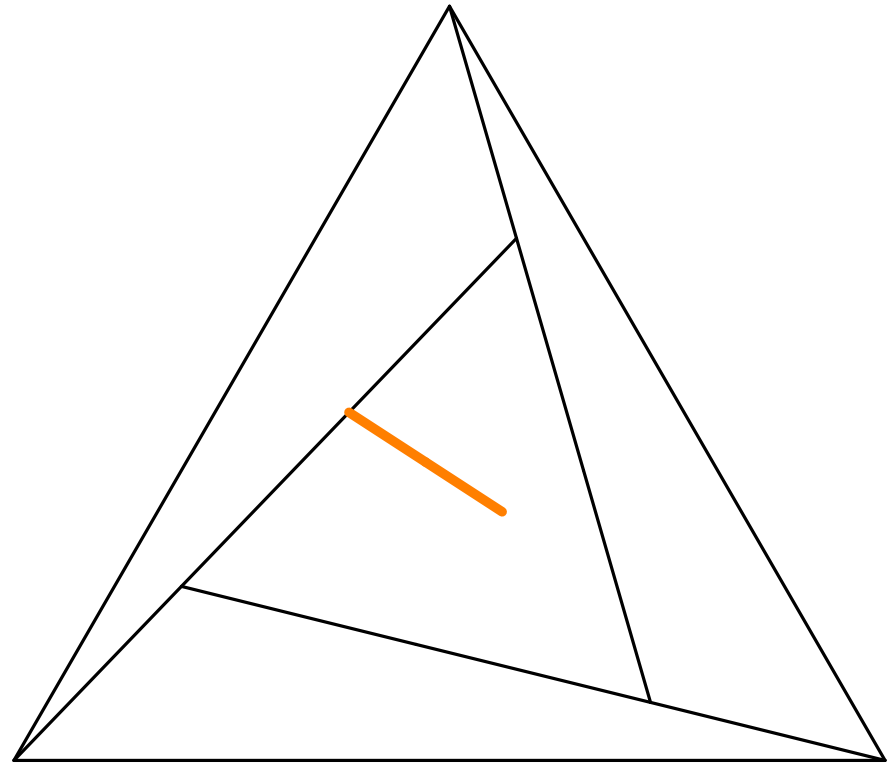
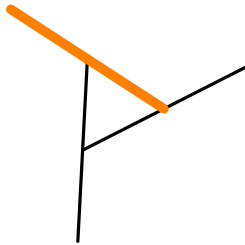


6

# Visual complexity

Planar graphs

Number of **geometric objects** for drawing

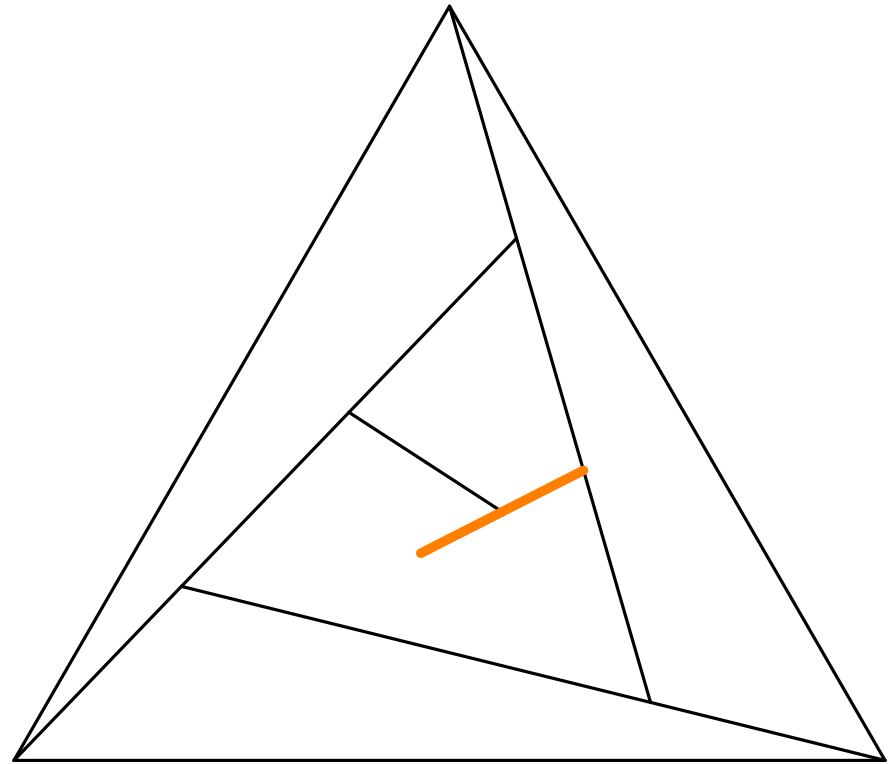
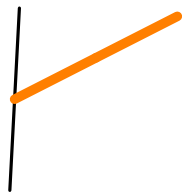


7

# Visual complexity

Planar graphs

Number of **geometric objects** for drawing

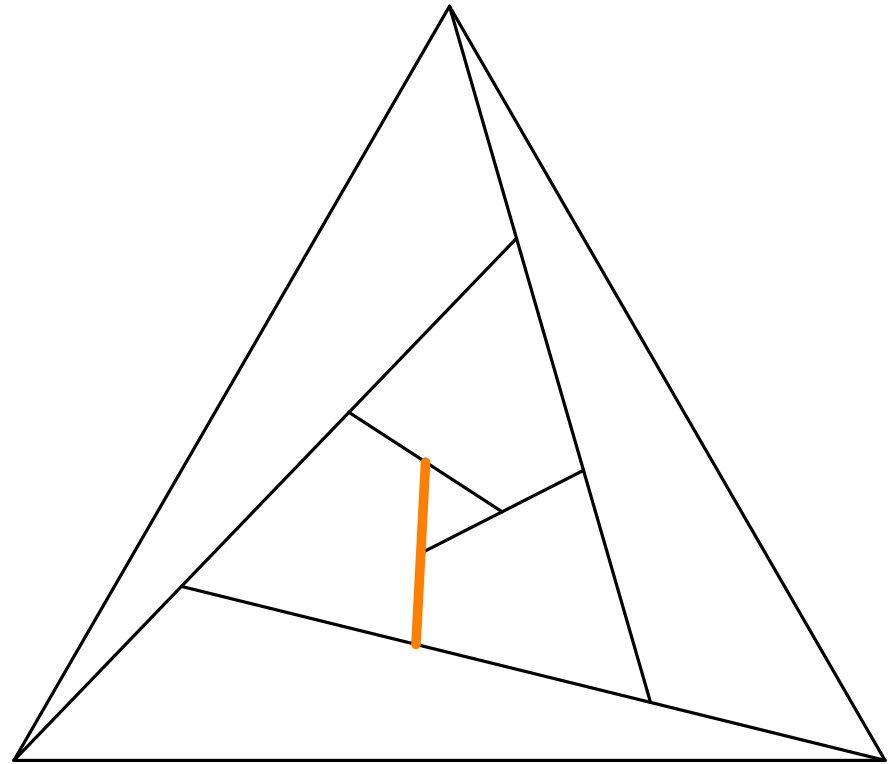


8

# Visual complexity

Planar graphs

Number of **geometric objects** for drawing



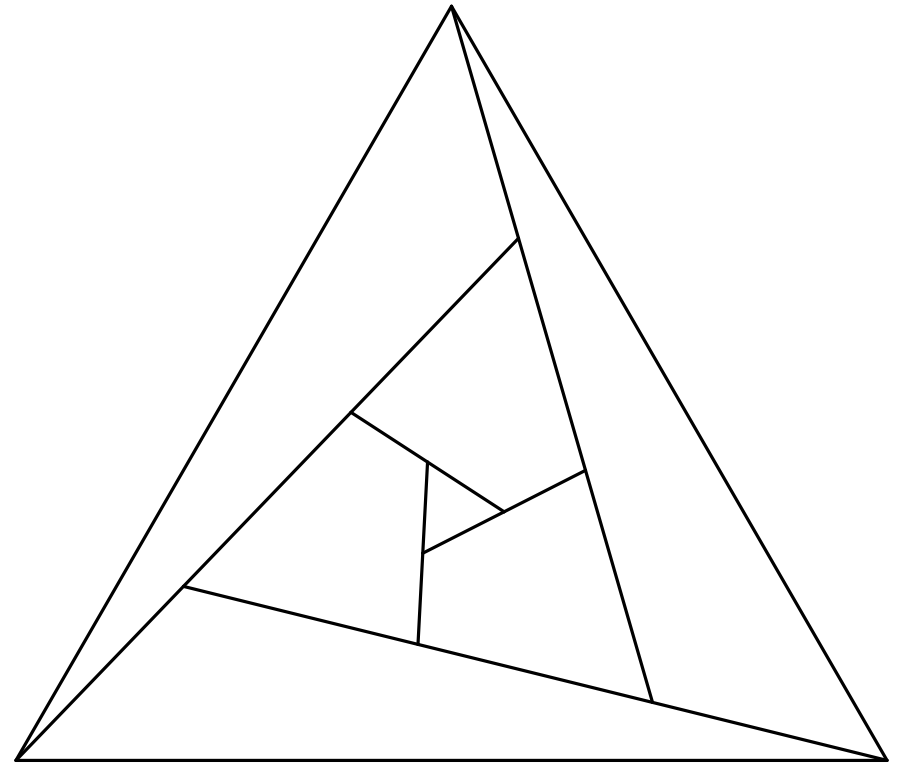
9



# Visual complexity

Planar graphs

Number of **geometric objects** for drawing



9 line segments for 18 edges

# Known results

	Class	Lower	Upper	
Segments	Tree	$K/2$	$K/2$	[Durocher et al, 2013]
	2- and 3-trees	$2V$	$2V$	[Dujmović et al, 2007]
	3-connected	$2V$	$5V/2$	[Dujmović et al, 2007]
	Triangulation	$2V$	$7V/3$	[Durocher, Mondal, 2014]
	Planar	$2V$	$16V/3 - E$	[Durocher, Mondal, 2014]

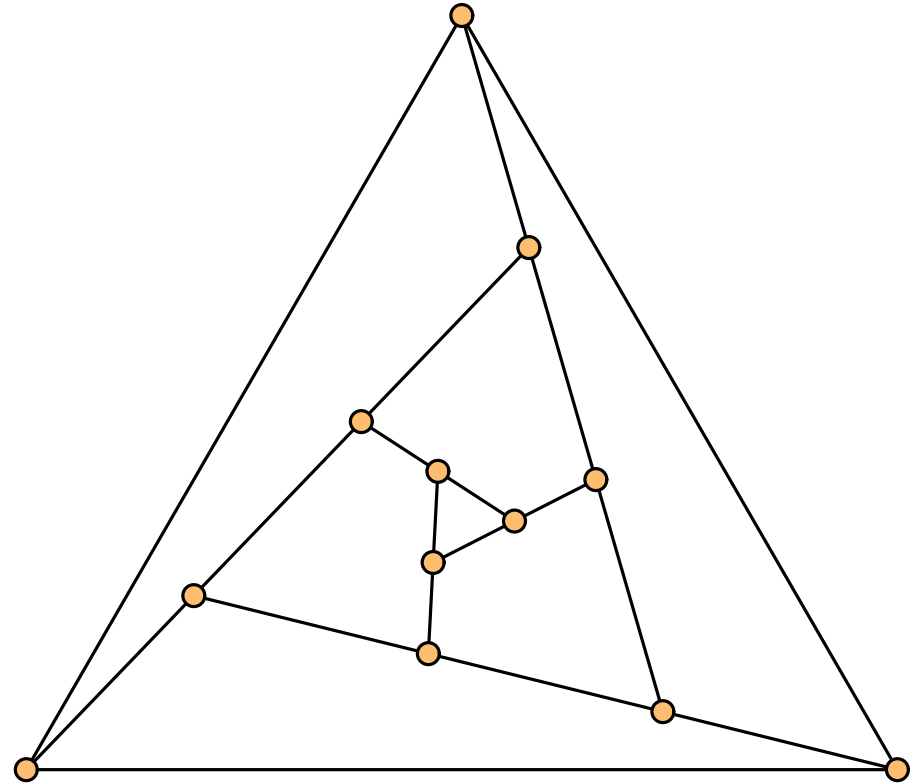
# Known results

	<b>Class</b>	<b>Lower</b>	<b>Upper</b>	
<b>Segments</b>	Tree	$K/2$	$K/2$	[Durocher et al, 2013]
	2- and 3-trees	$2V$	$2V$	[Dujmović et al, 2007]
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	Triangulation	$2V$	$7V/3$	[Durocher, Mondal, 2014]
	Planar	$2V$	$16V/3 - E$	[Durocher, Mondal, 2014]
<b>Circ. arcs</b>	3-trees	$E/6$	$11E/18$	[Schulz, 2013]
	3-connected	$E/6$	$2E/3$	[Schulz, 2013]

# The remainder of this talk

Line-segment drawings

Planar cubic 3-connected graphs



# The remainder of this talk

Line-segment drawings

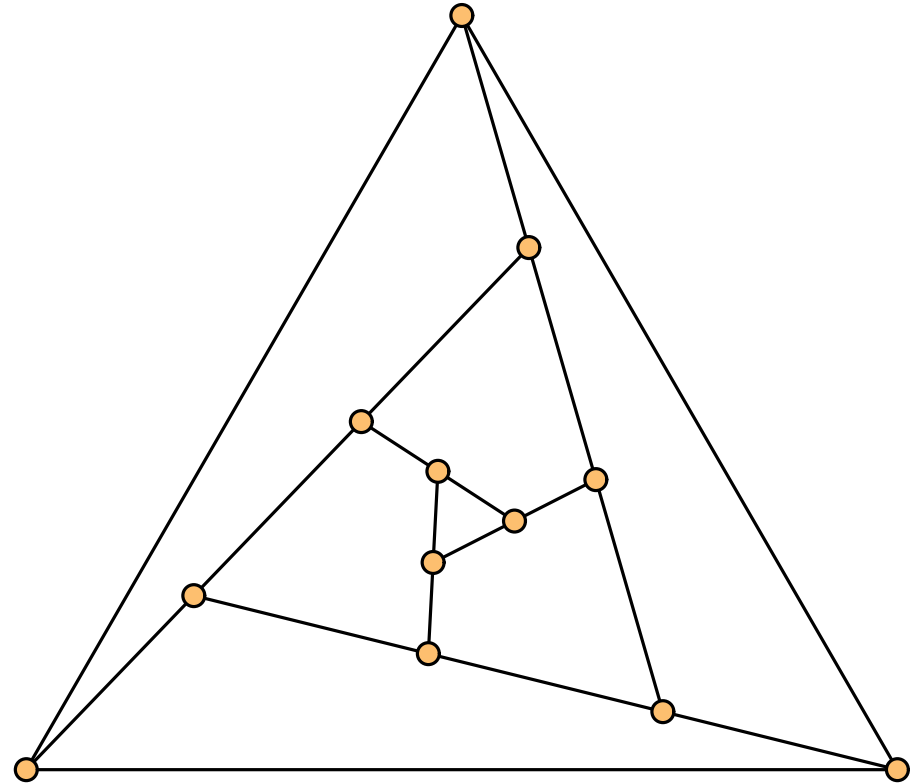
Planar cubic 3-connected graphs

Two new algorithms

$n/2 + 3$  segments

[Mondal et al, 2013]

Resolve flaw & improved



# The remainder of this talk

Line-segment drawings

Planar cubic 3-connected graphs

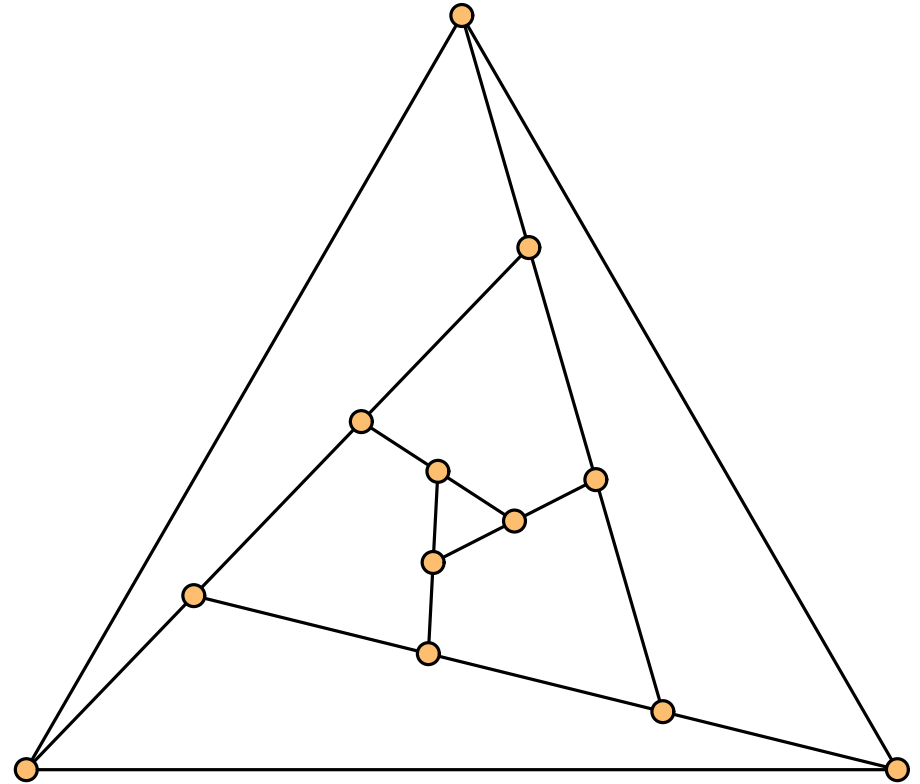
Two new algorithms

$n/2 + 3$  segments

[Mondal et al, 2013]

Resolve flaw & improved

Experimental comparison

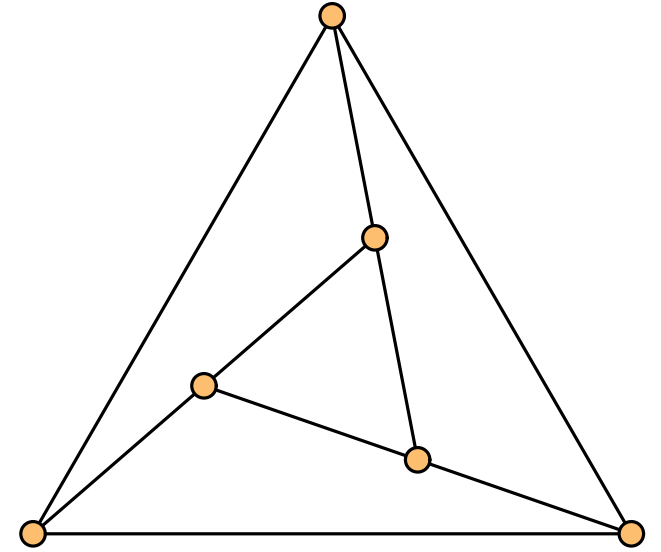


# Deconstruction algorithm

# Deconstruction algorithm

## Theorem.

Every graph can be constructed  
from the triangular prism  
with **insertions**  
maintaining a given outer face.

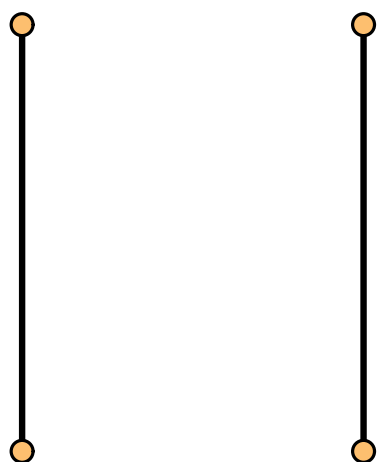
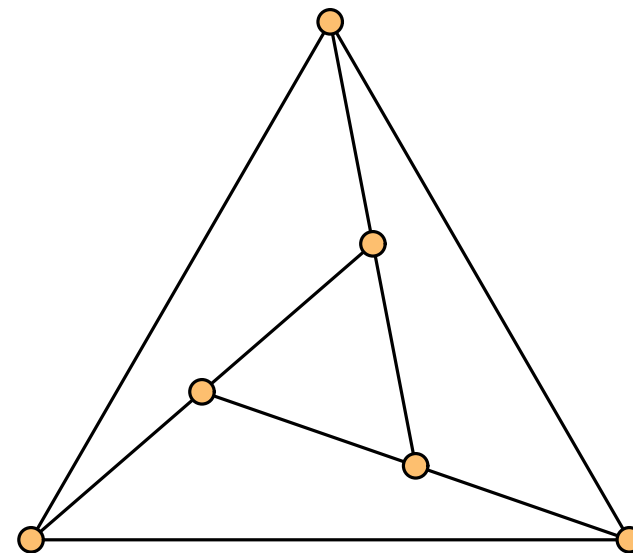




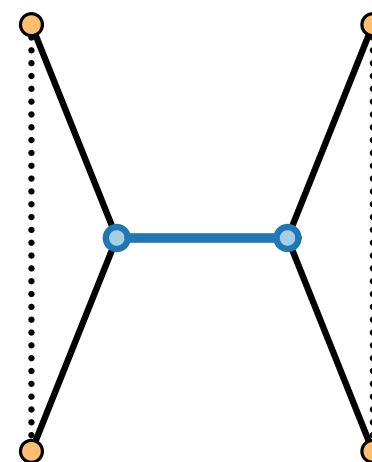
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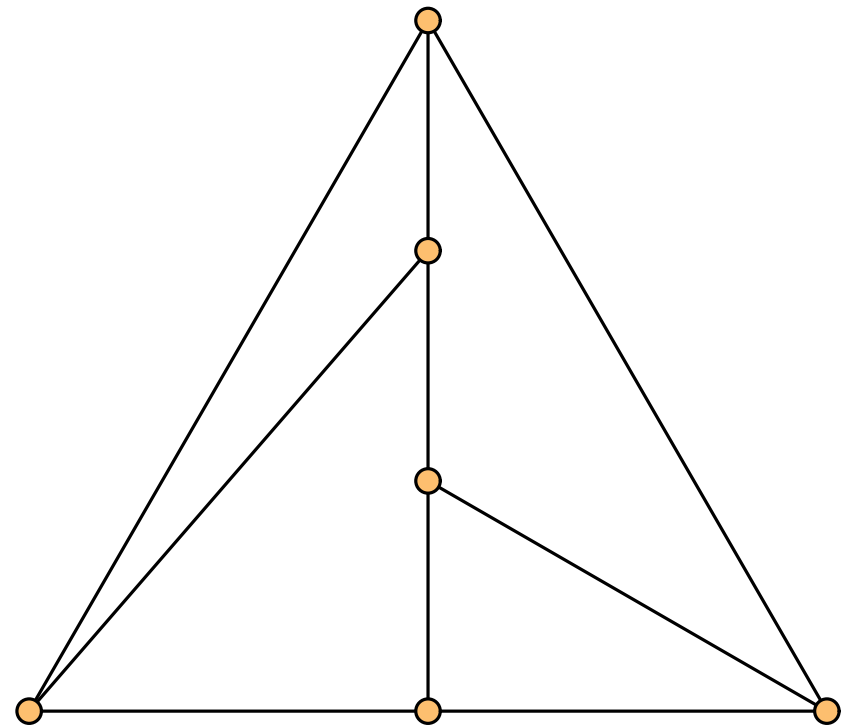
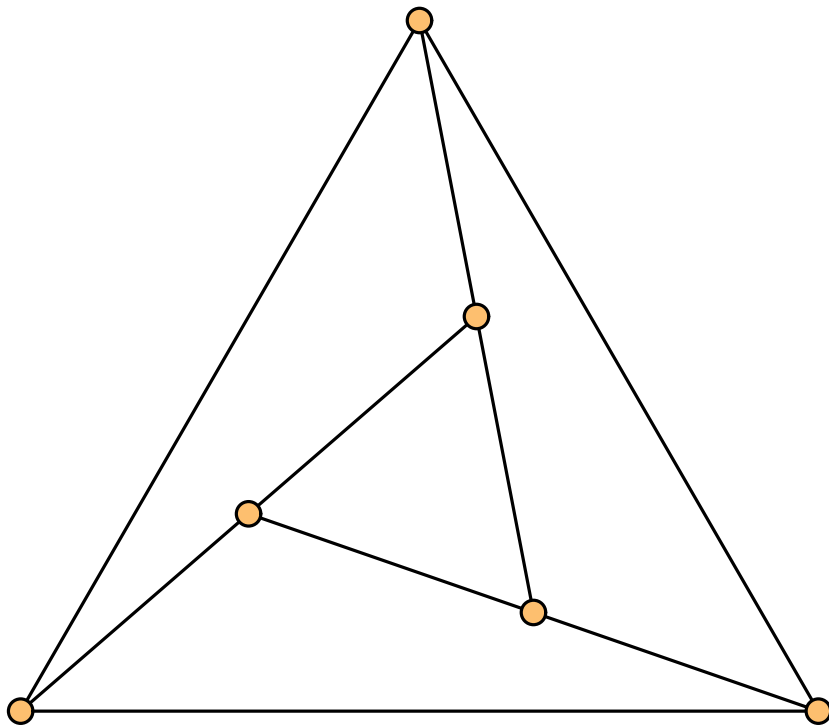
Insertion



# Deconstruction algorithm

## Algorithm

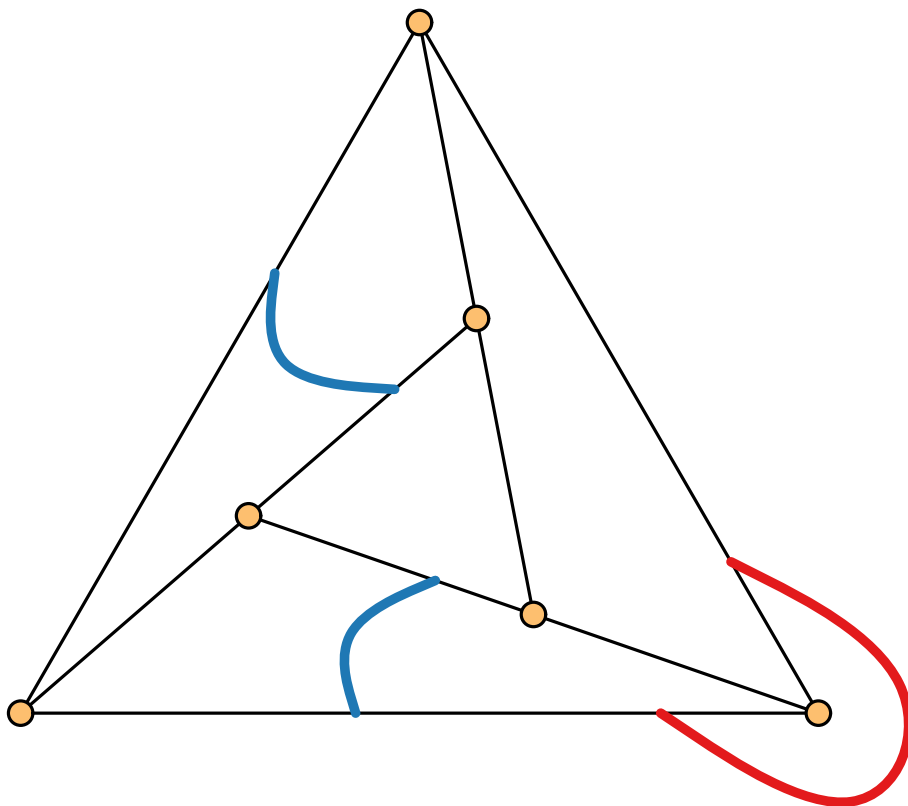
1. Draw triangular prism



# Deconstruction algorithm

## Algorithm

1. Draw triangular prism
2. Construct graph, maintaining drawing



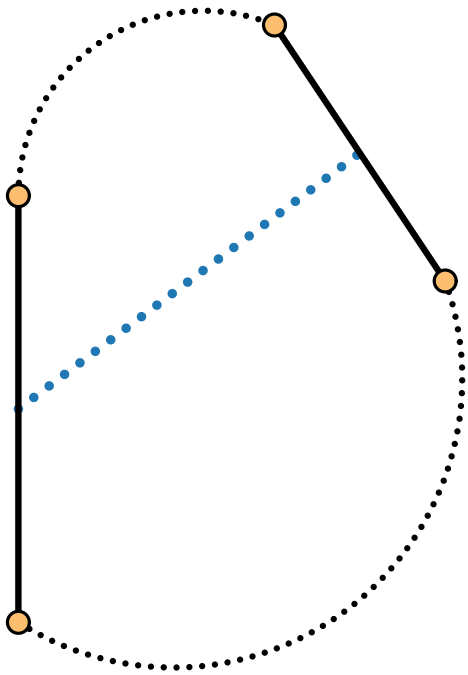
Inner faces are **convex**

No insertions on **outer face**

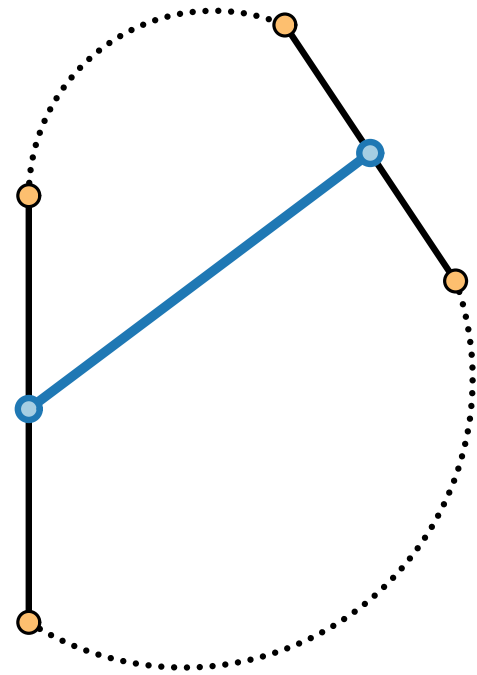
# Deconstruction algorithm

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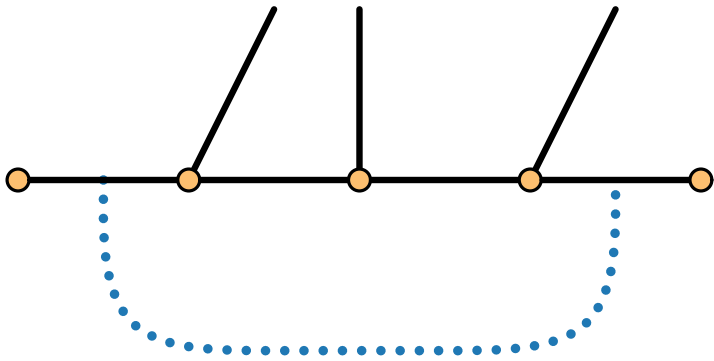
Insertion



# Deconstruction algorithm

## Algorithm

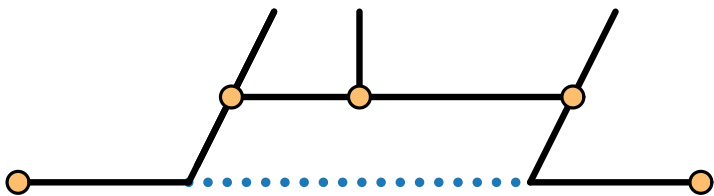
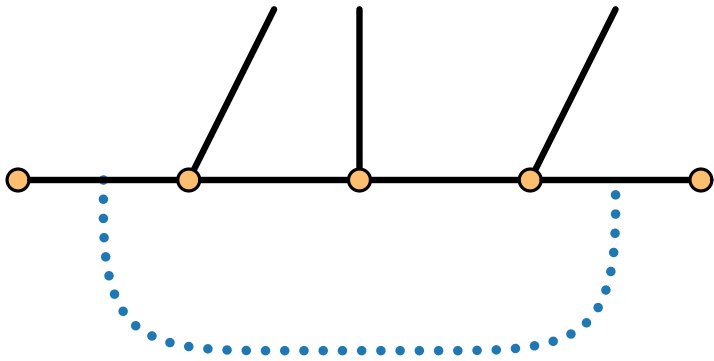
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# Deconstruction algorithm

## Algorithm

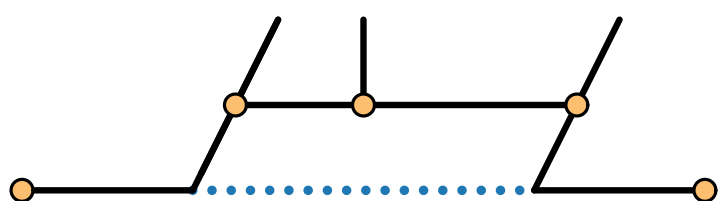
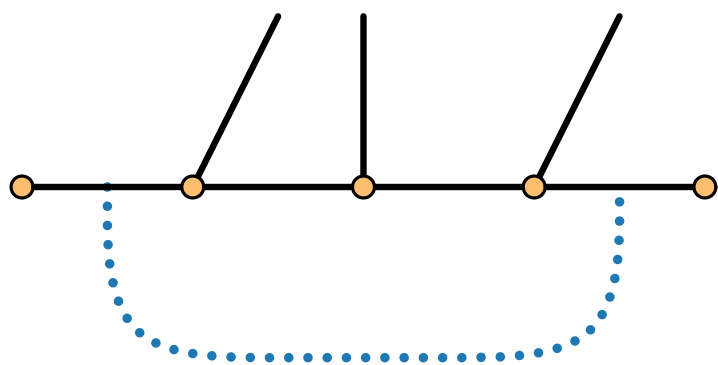
1. Draw triangular prism
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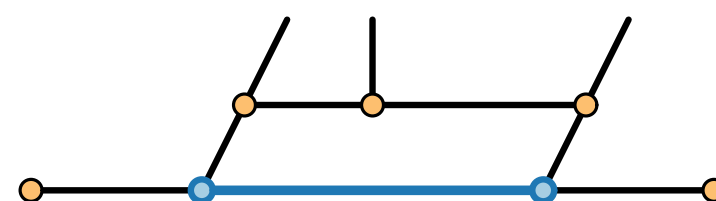
# Deconstruction algorithm

## Algorithm

1. Draw triangular prism
2. Construct graph, maintaining drawing



Insertion



# Windmill algorithm

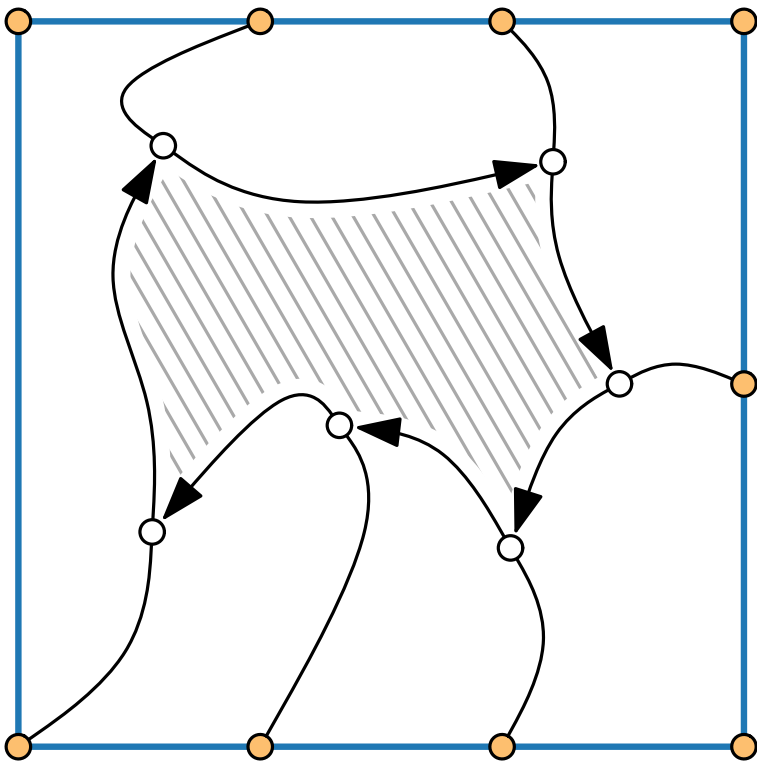


# Windmill algorithm

## Algorithm

**Pre:** cycle  $C$  drawn convex

**Post:** inside of  $C$  drawn

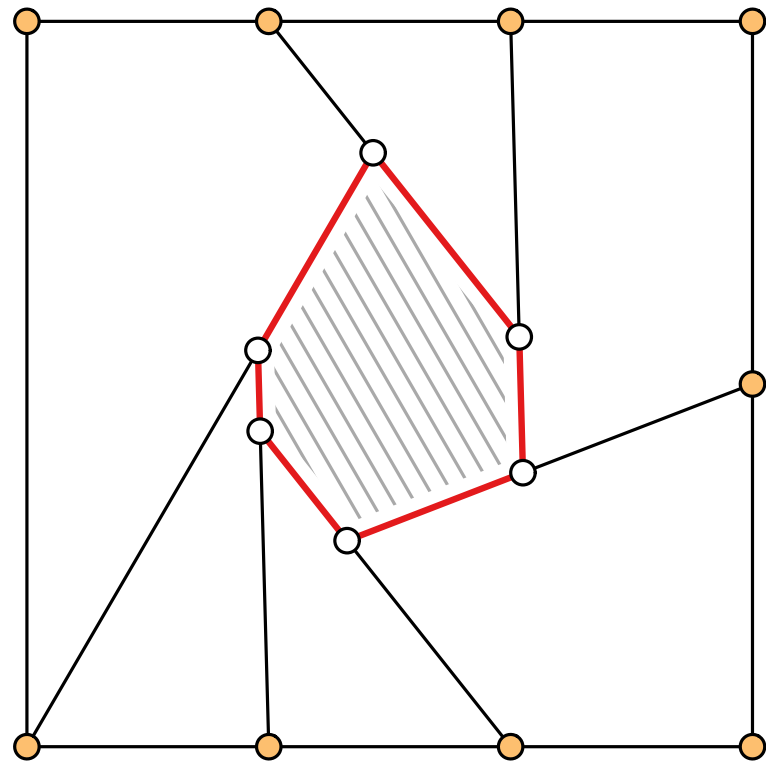
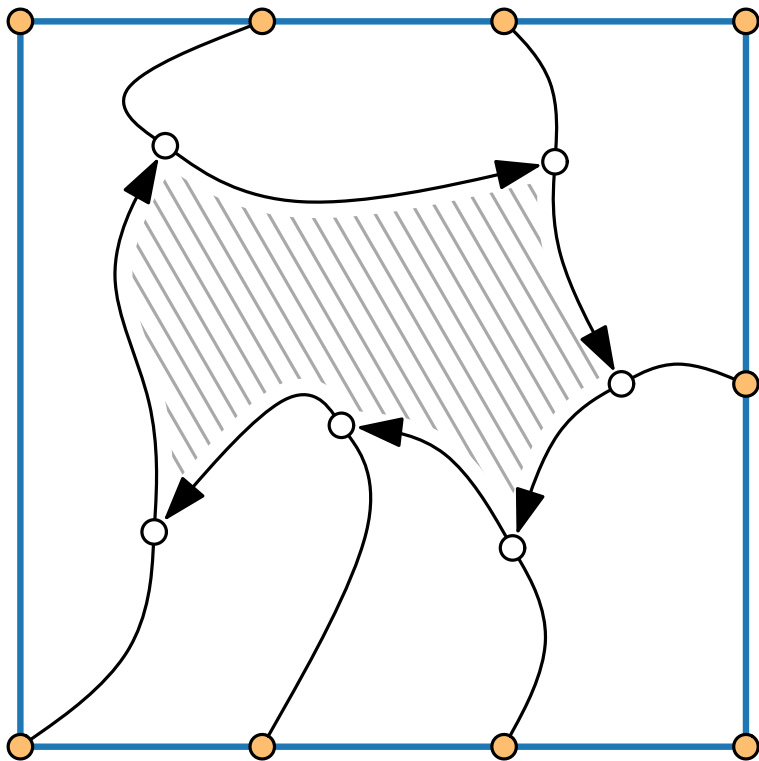


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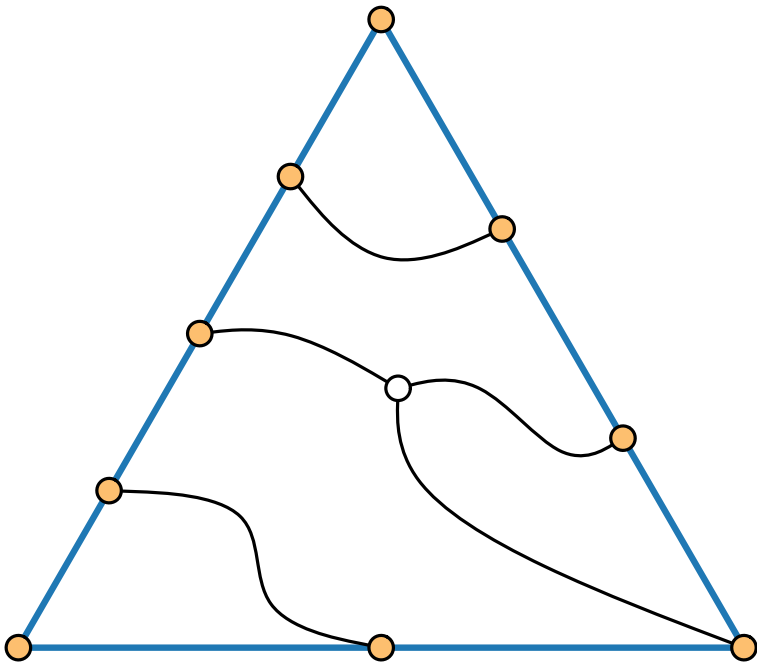


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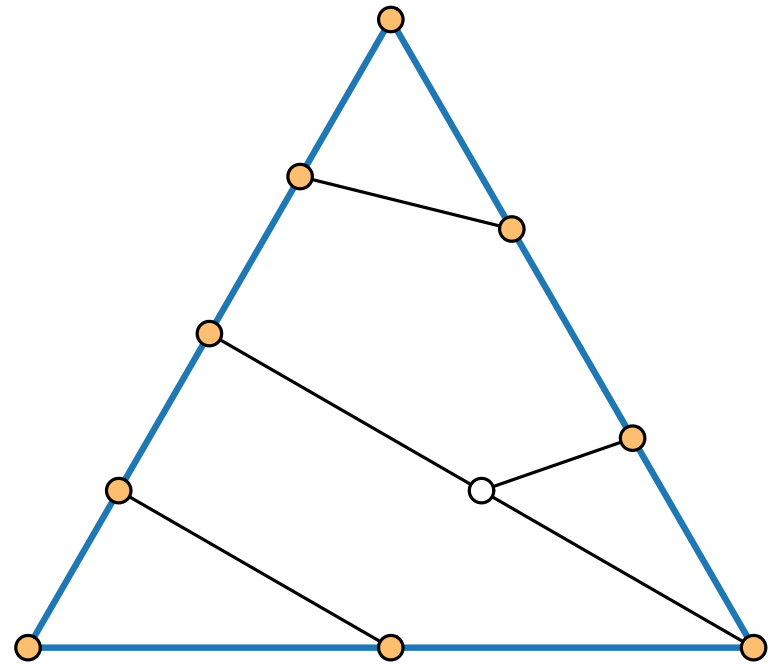
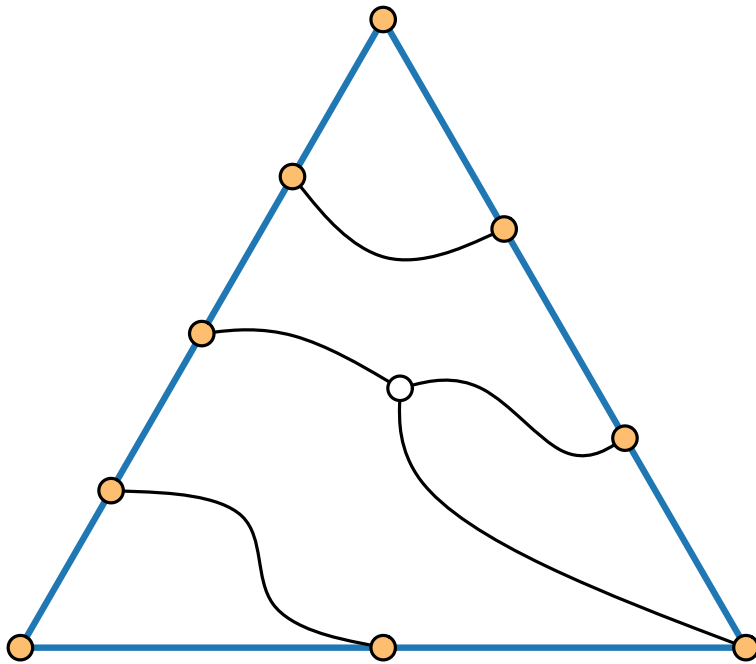


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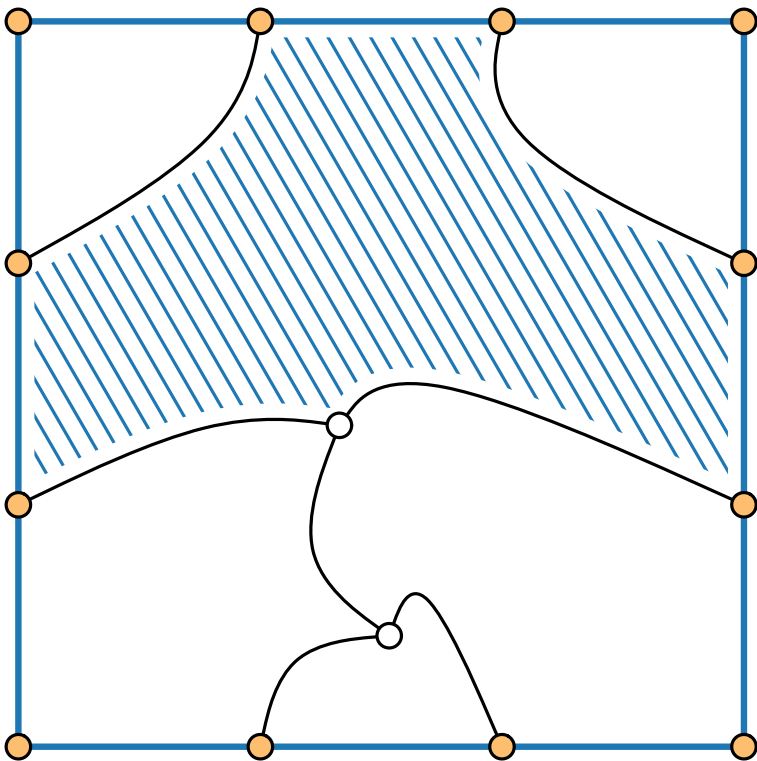


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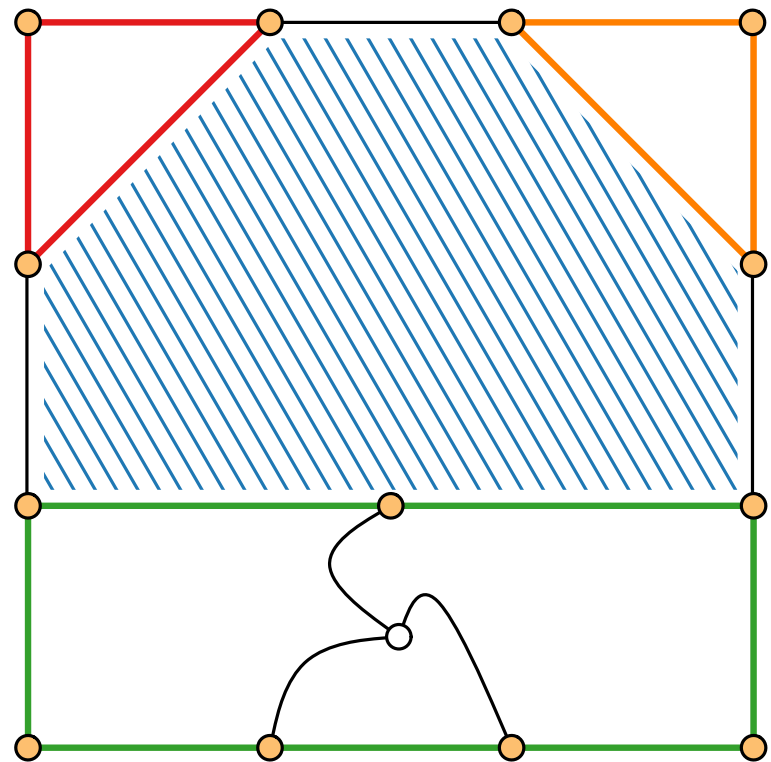
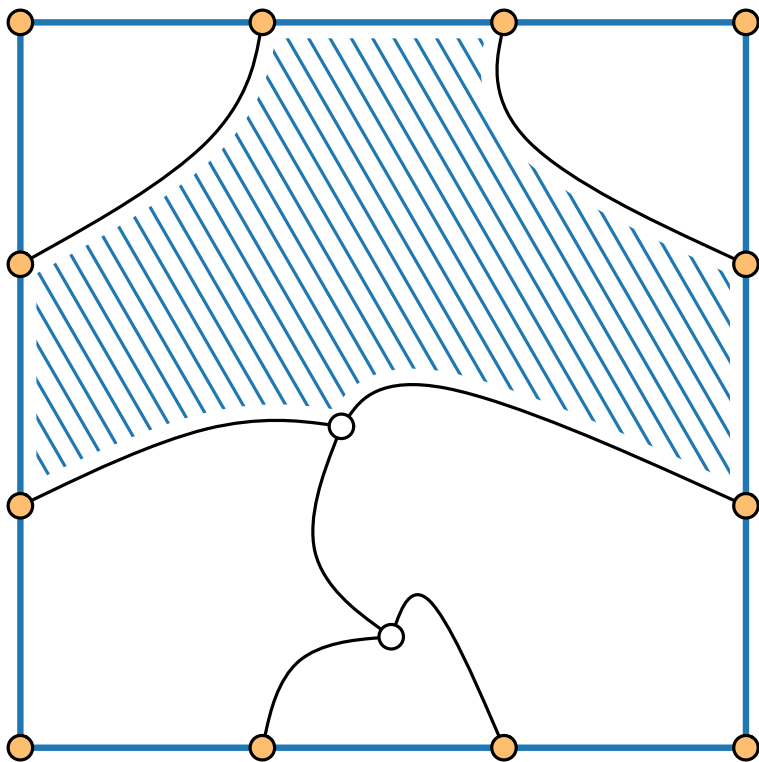


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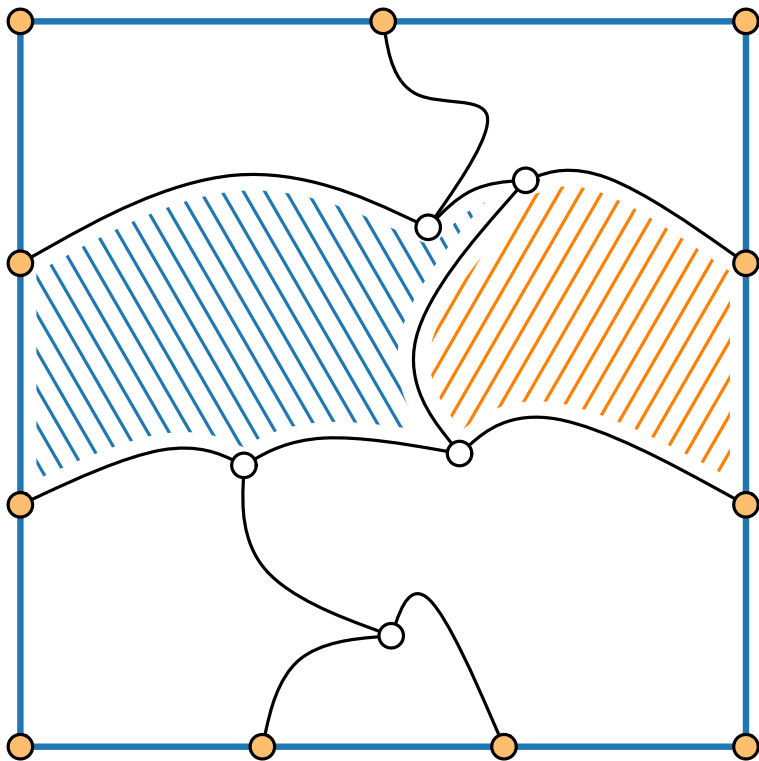


# Windmill algorithm

## Algorithm

**Pre:** cycle  $C$  drawn convex

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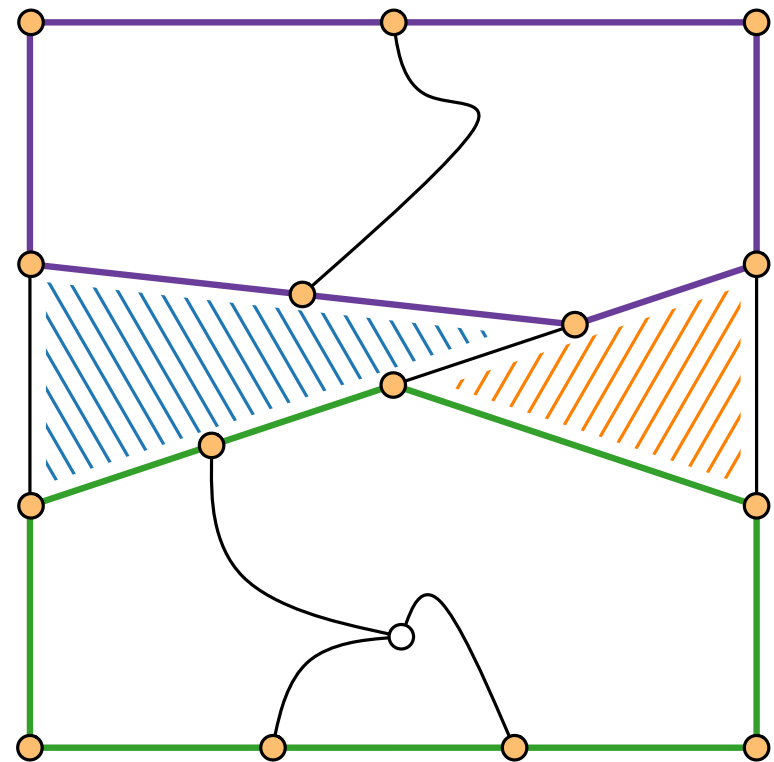
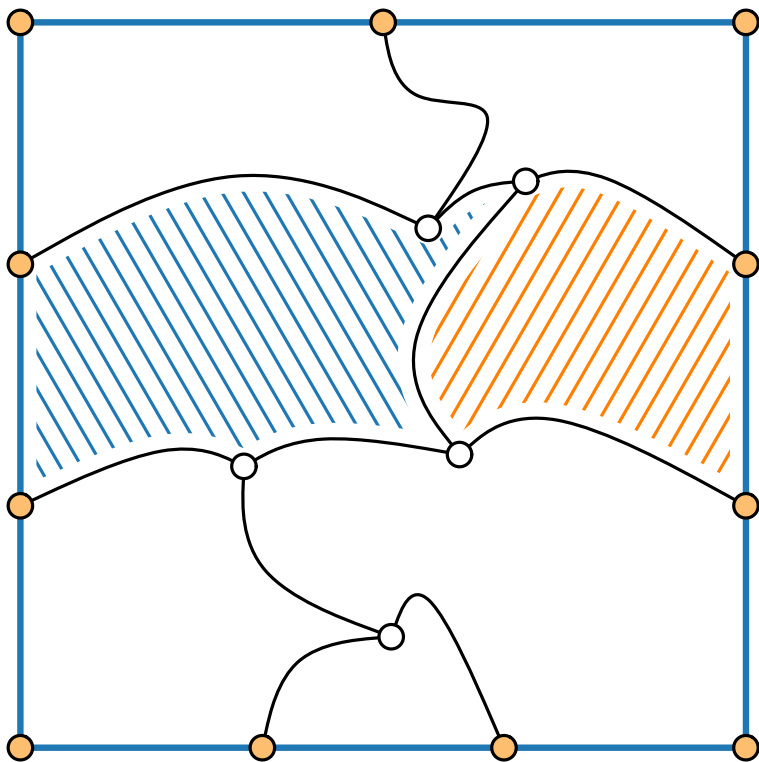


# Windmill algorithm

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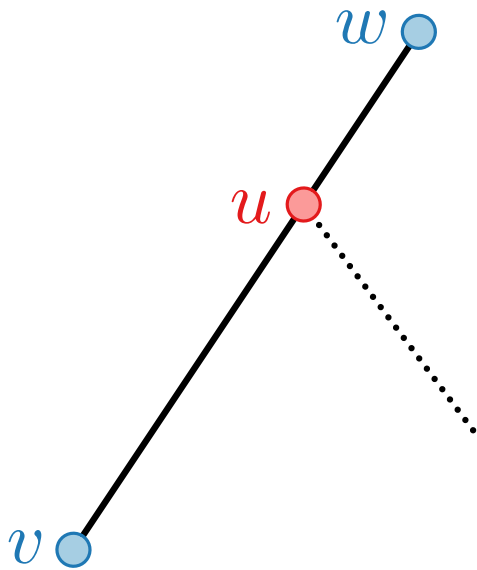


# Postprocessing

Set of harmonic equations

[Aerts & Felsner, 2013]

$$u = \lambda v + (1 - \lambda)w, \text{ for } \lambda \in (0, 1)$$



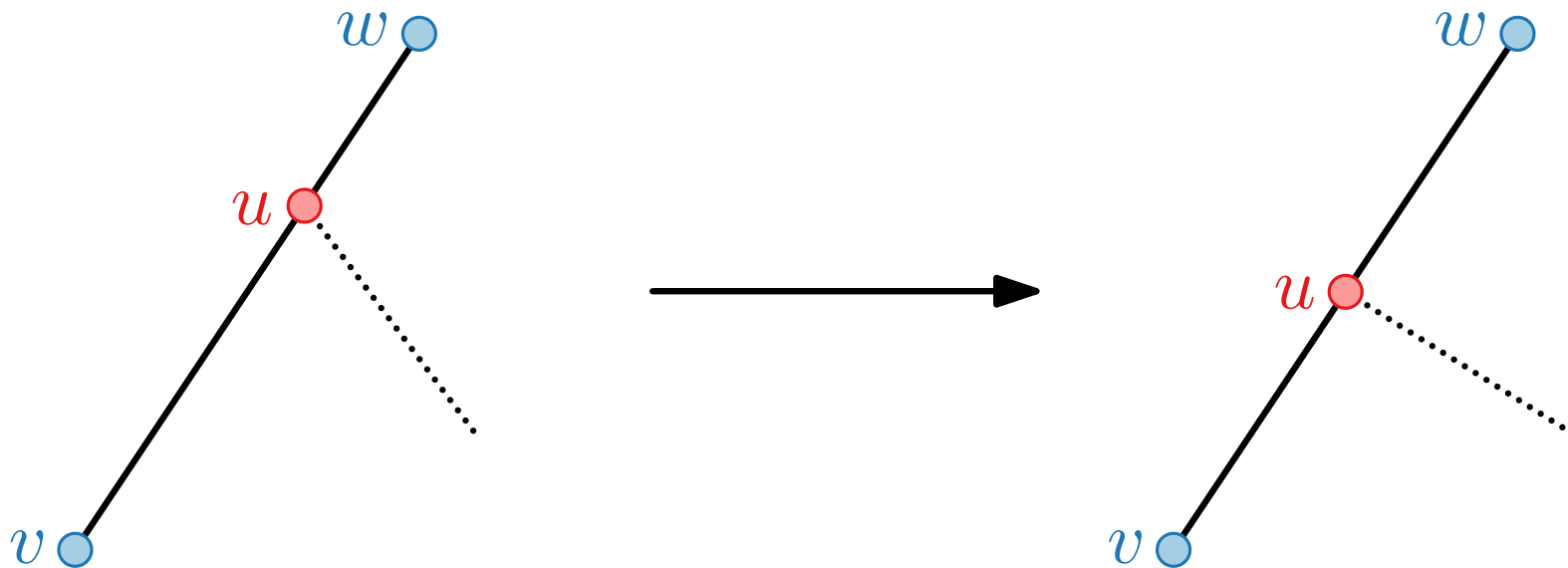
# Postprocessing

Set of harmonic equations

[Aerts & Felsner, 2013]

$$u = \lambda v + (1 - \lambda)w, \text{ for } \lambda \in (0, 1)$$

Solve for **uniform edge length**, i.e.  $\lambda = 1/2$



[Mondal et al, 2013]

## “Grid”

$n/2 + 4$  segments

6 slopes

$(n/2 + 1)^2$  grid

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$n/2 + 4$  segments

6 slopes

$(n/2 + 1)^2$  grid

---

Resolved flaw in algorithm

## “Grid”

$n/2 + 4$  segments

6 slopes

$(n/2 + 1)^2$  grid

## “Min”

$n/2 + 3$  segments

7 slopes

Not on a grid

---

Resolved flaw in algorithm

## “Grid”

$n/2 + 4$  segments

6 slopes

$(n/2 + 1)^2$  grid

Resolved flaw in algorithm

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$n/2 + 3$  segments

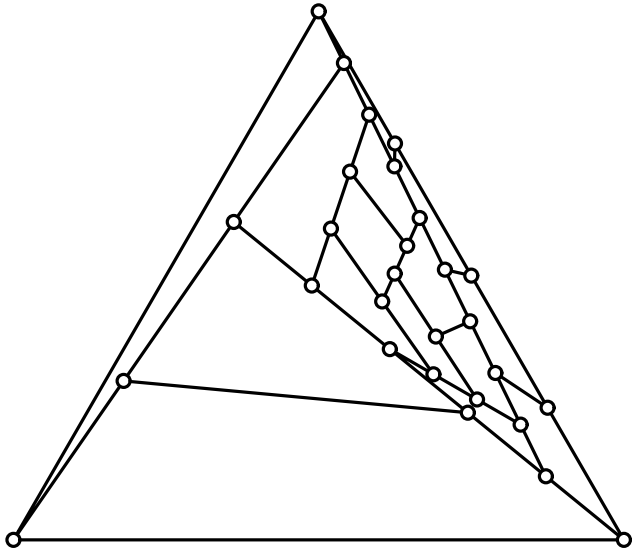
7 slopes

Not on a grid

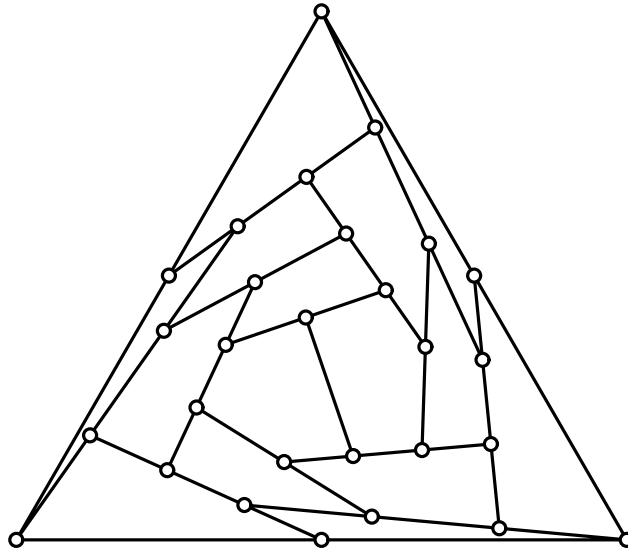
Reduced to 6 slopes

On a grid

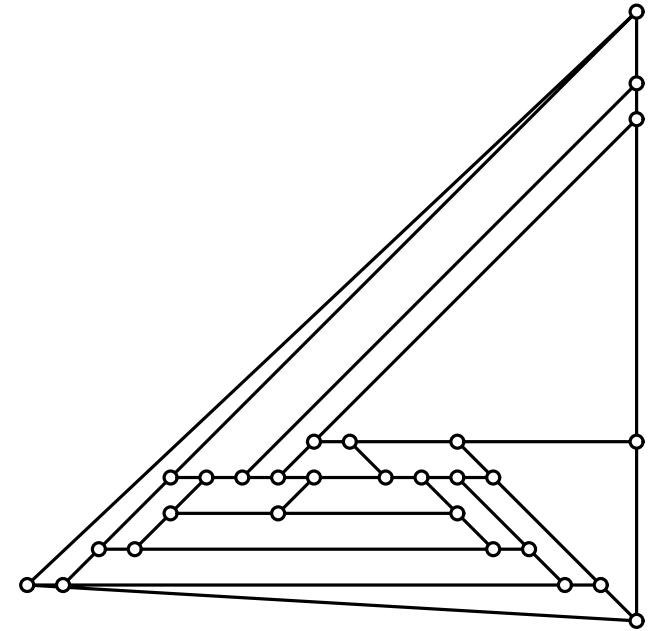
# Three algorithms



Deconstruction



Windmill



[Mondal et al, 2013]



# Measuring layout quality

2000 graphs with 24...30 vertices  
using plantri

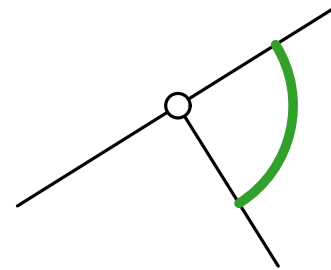
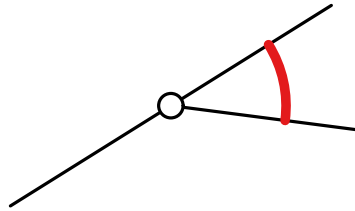
**Six measures** for each graph-algorithm pair

# Measuring layout quality

2000 graphs with 24...30 vertices  
using [plantri](#)

**Six measures** for each graph-algorithm pair

Angular resolution

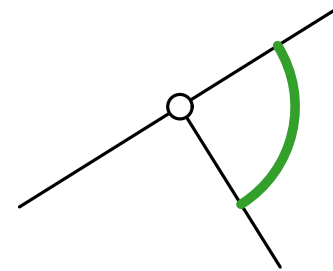
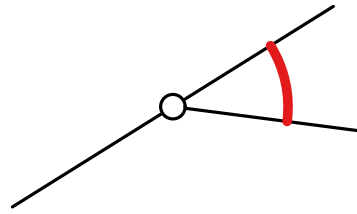


# Measuring layout quality

2000 graphs with 24...30 vertices  
using [plantri](#)

**Six measures** for each graph-algorithm pair

Angular resolution



Edge length

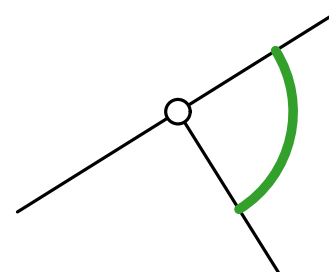
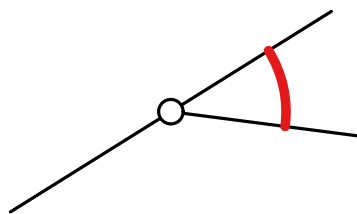


# Measuring layout quality

2000 graphs with 24...30 vertices  
using [plantri](#)

**Six measures** for each graph-algorithm pair

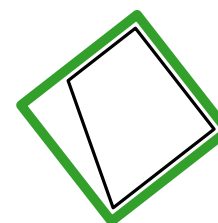
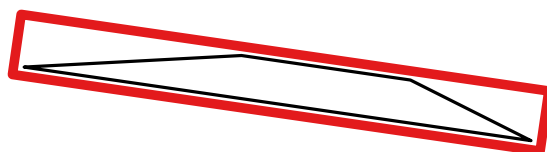
Angular resolution



Edge length



Face aspect ratio

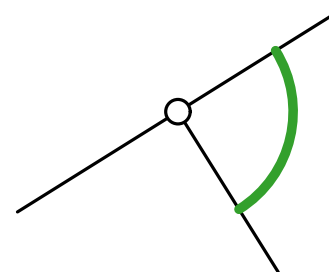
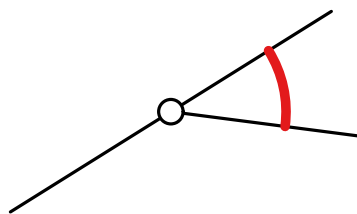


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**Six measures** for each graph-algorithm pair

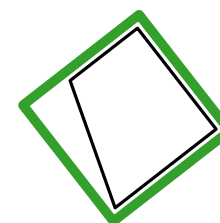
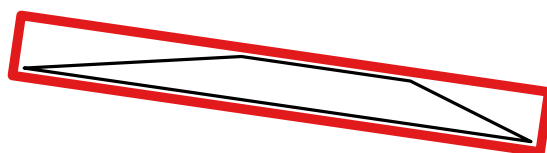
Angular resolution



Edge length



Face aspect ratio



Average and worst-case

# Angular resolution

## Average

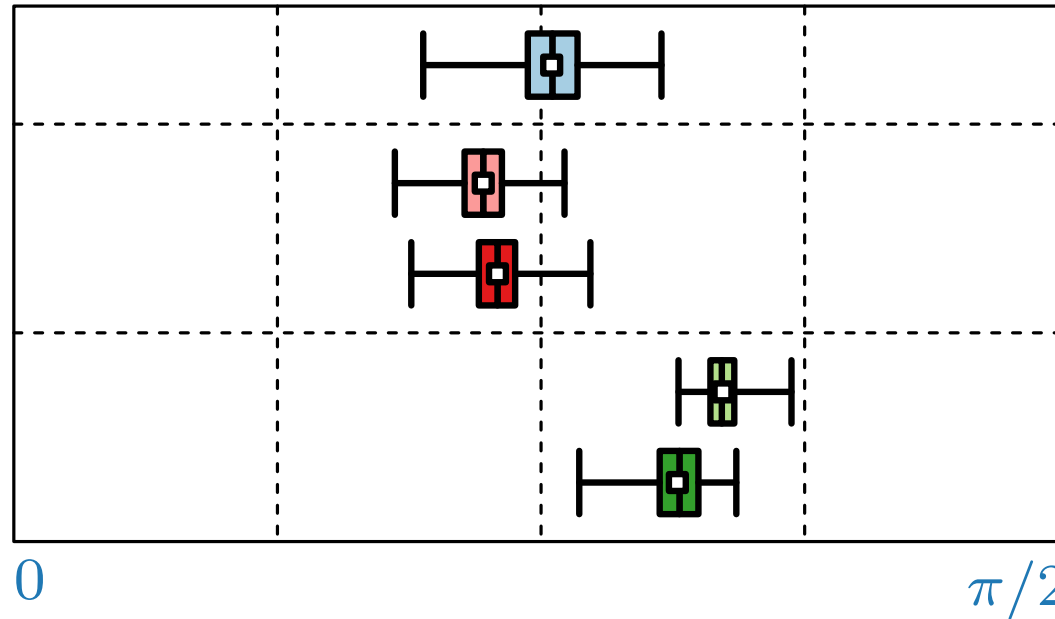
WIN

DEC

DEC-ALT

MON-GRID

MON-MIN



## Minimum

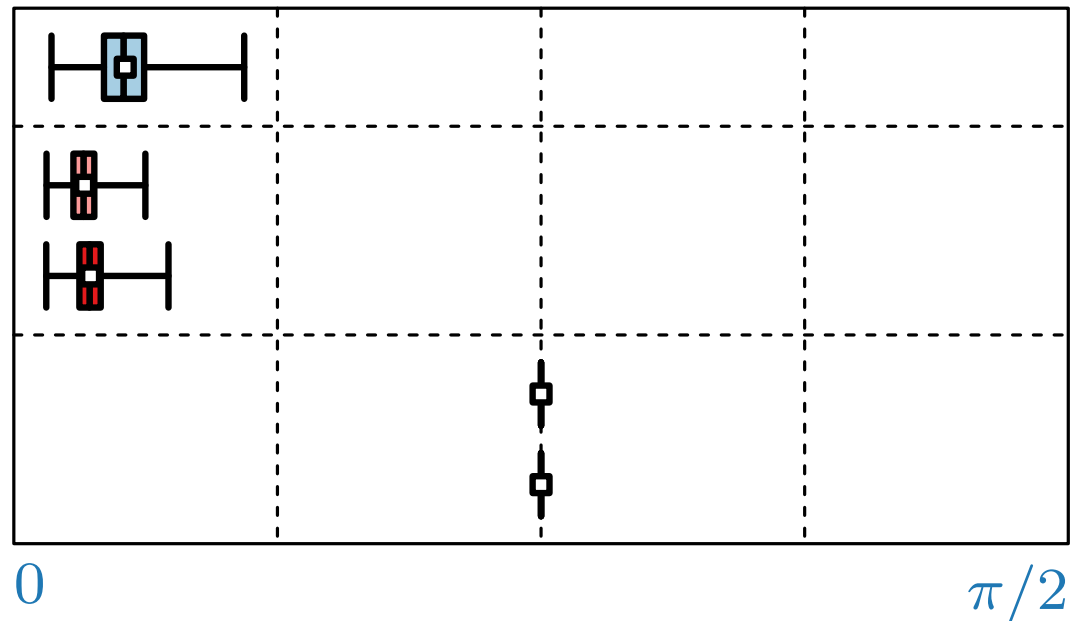
WIN

DEC

DEC-ALT

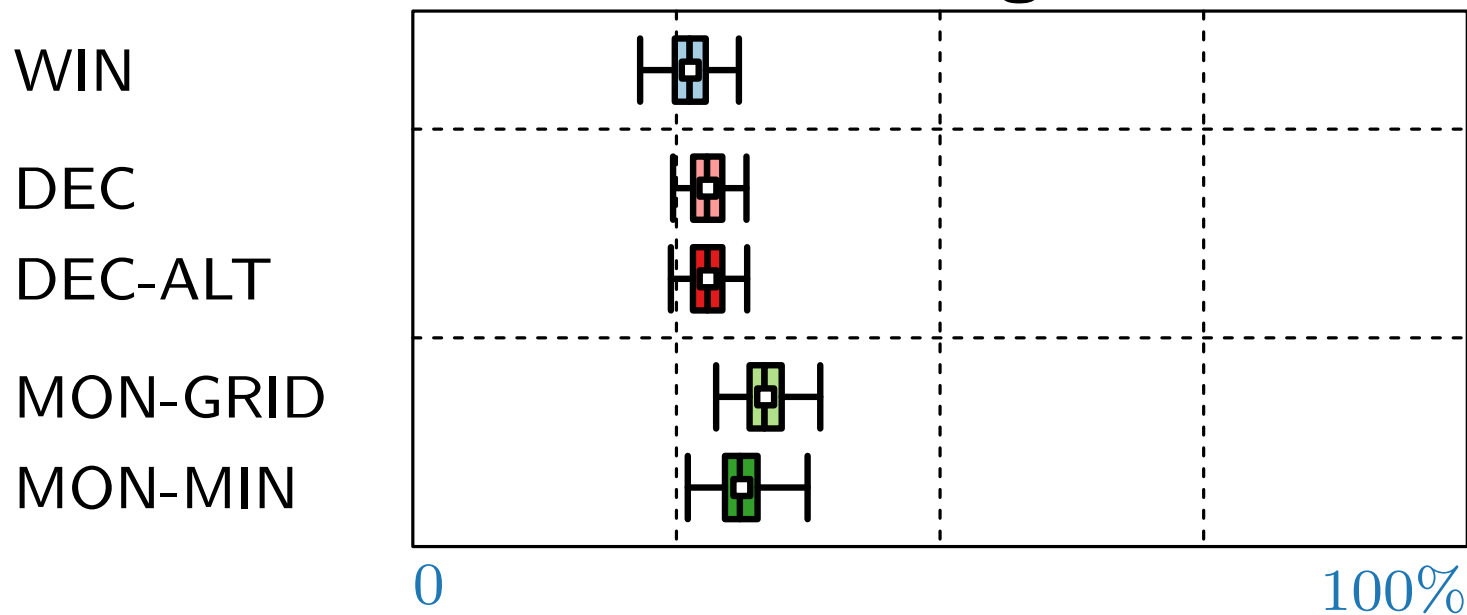
MON-GRID

MON-MIN

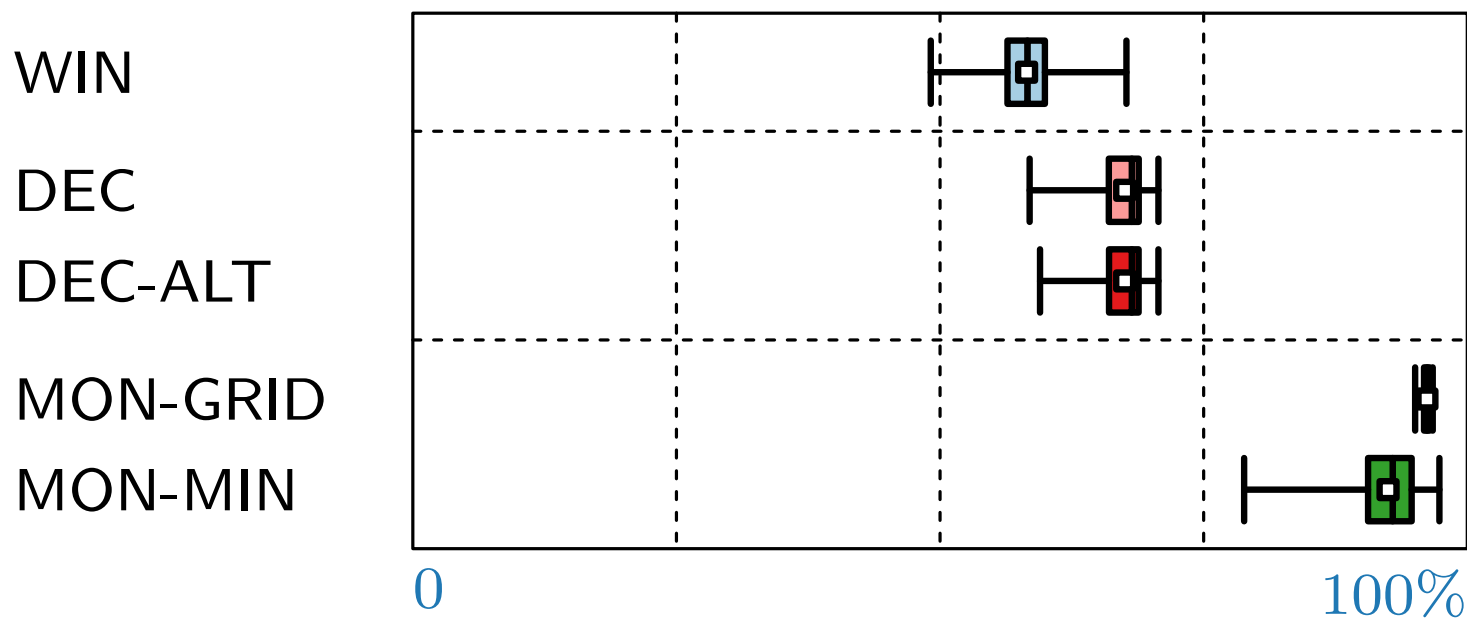


# Edge length

## Average

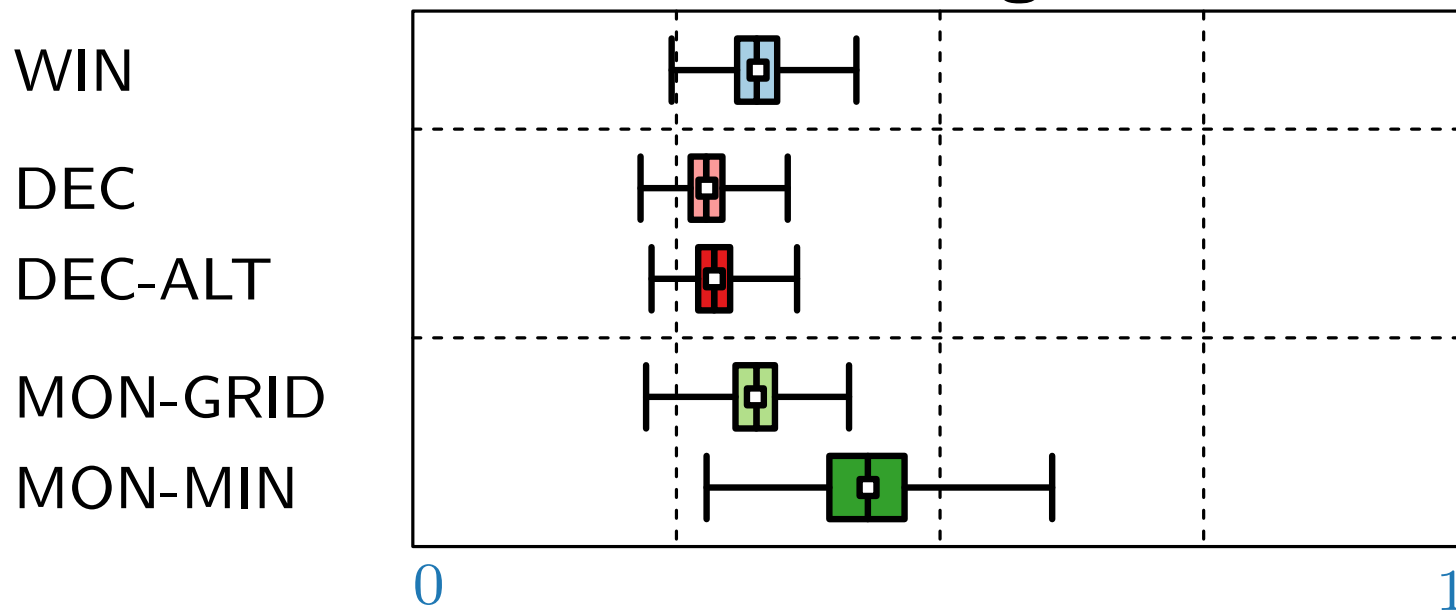


## Maximum

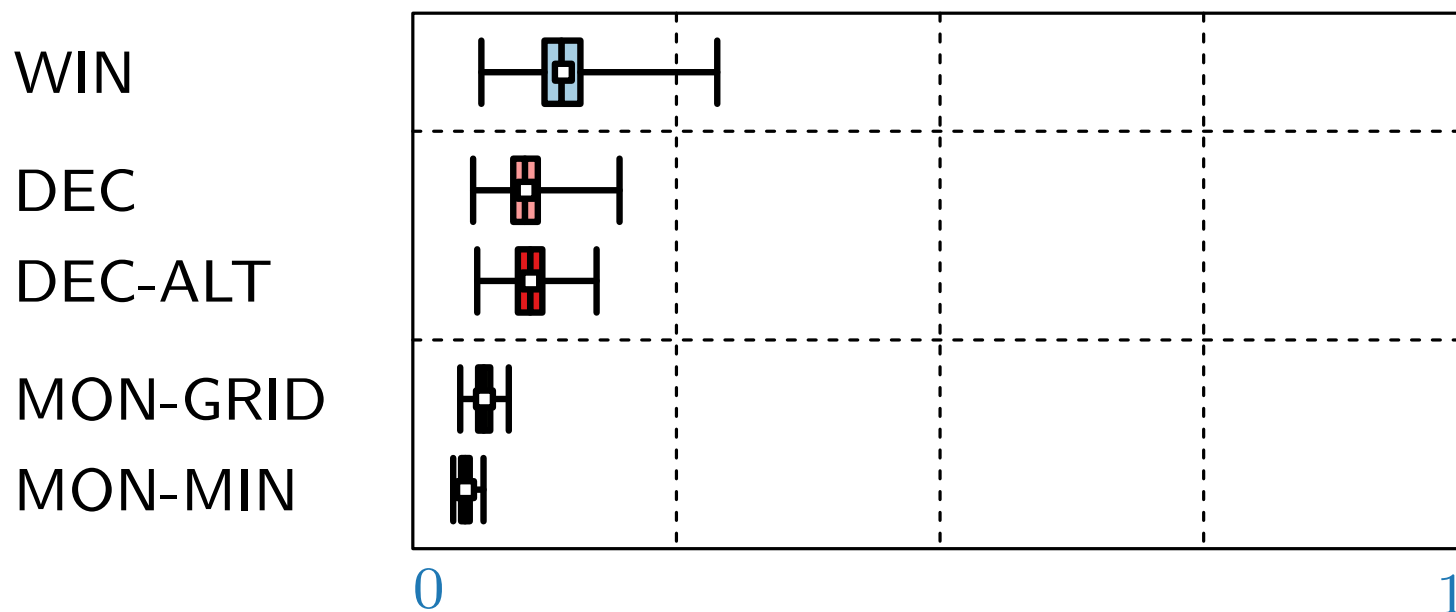


# Face aspect ratio

## Average

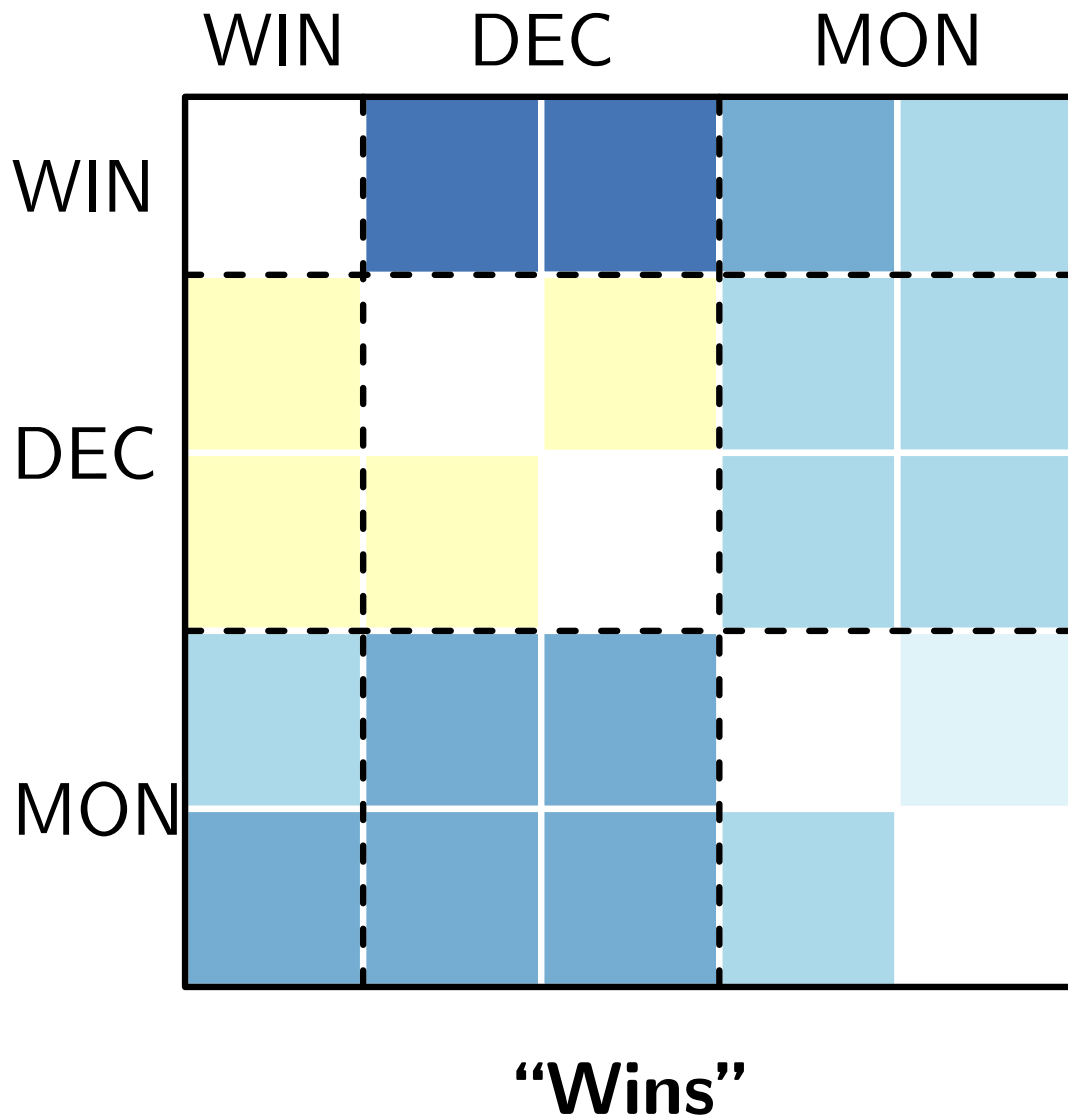


## Minimum

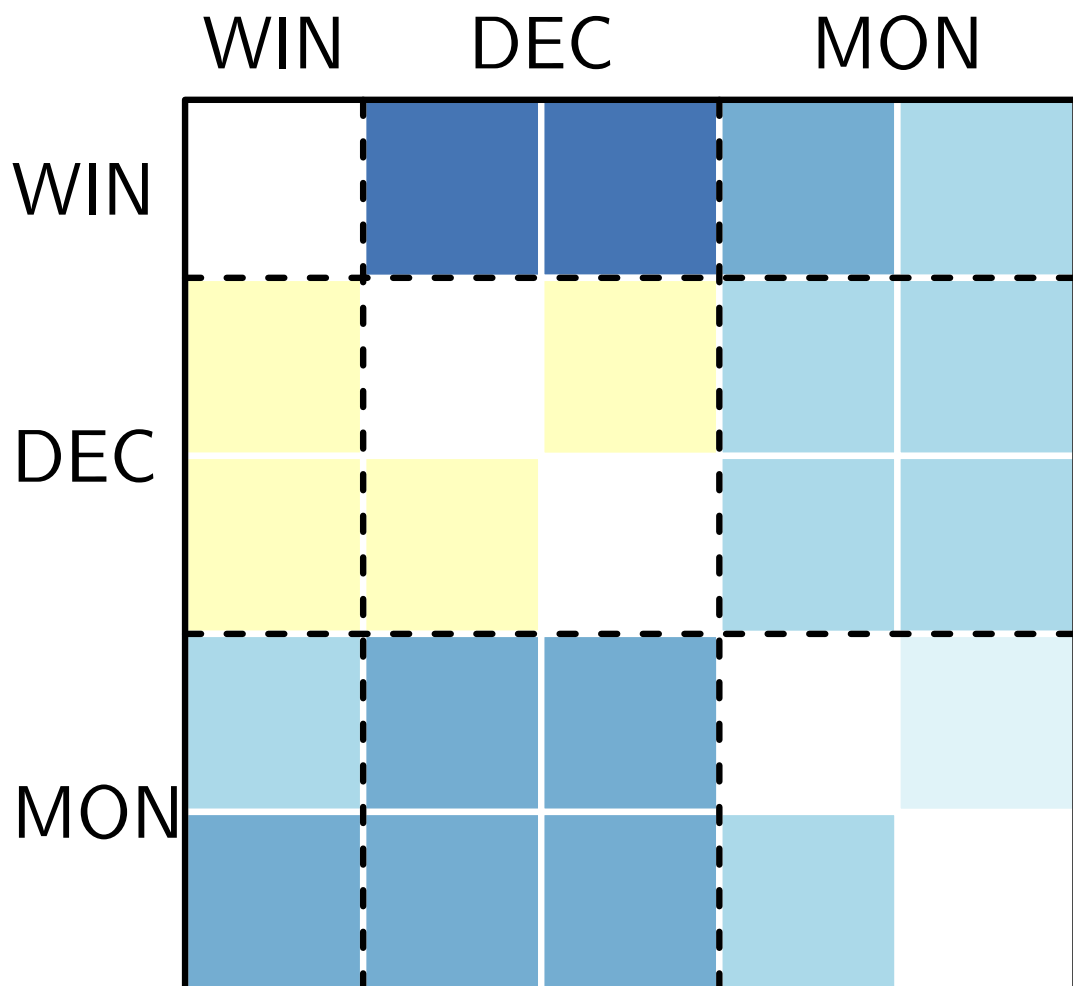




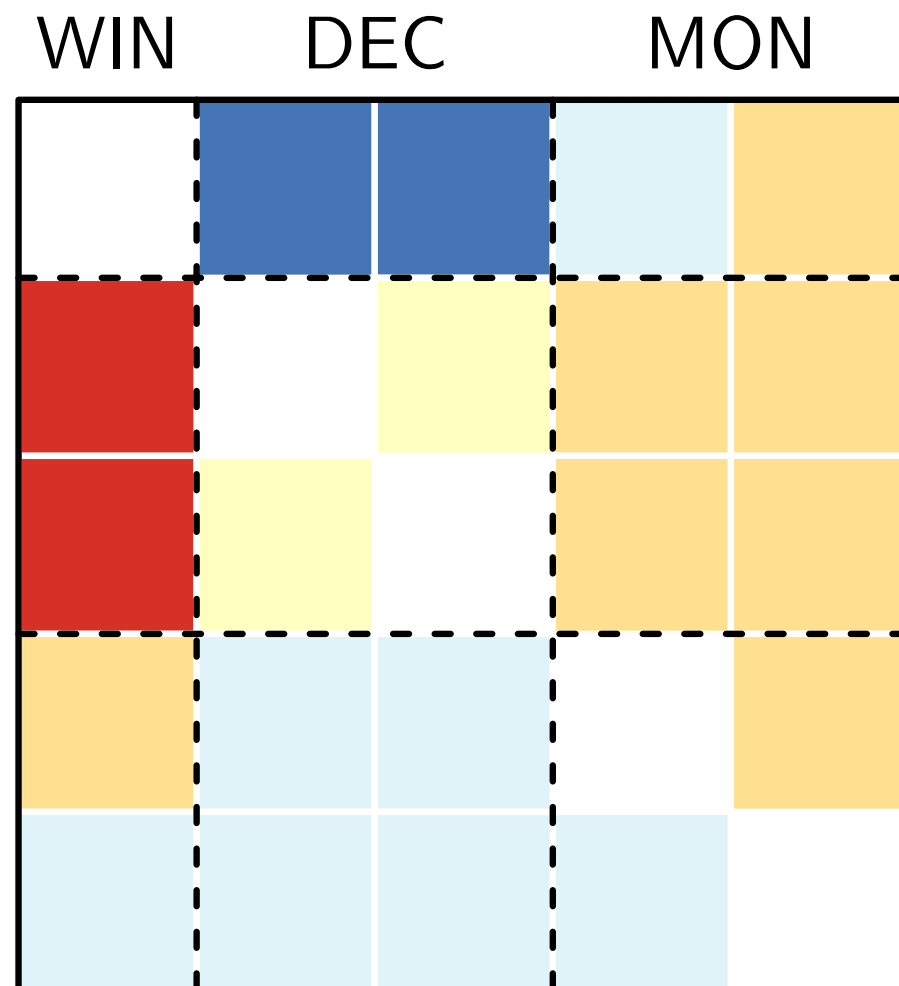
# Experiment summary



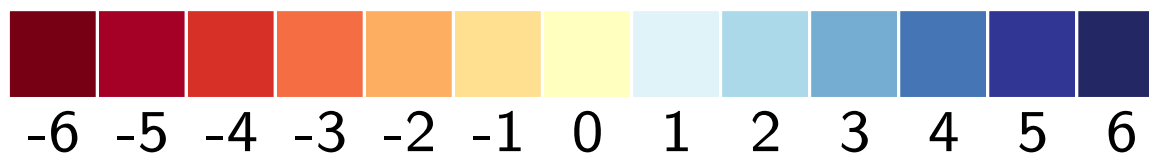
# Experiment summary



“Wins”



“Wins” minus “Losses”



# Conclusion

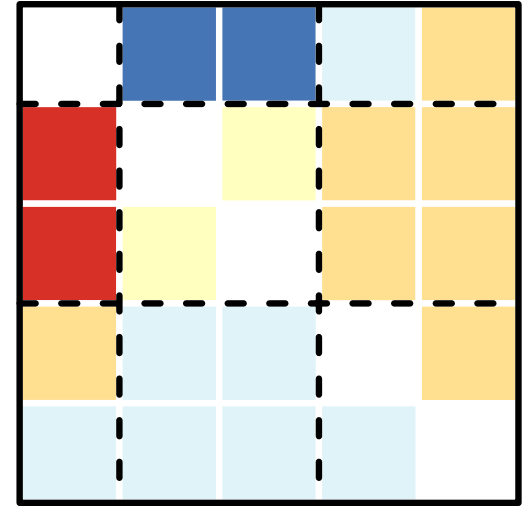
## Minimal visual complexity

Two new algorithms

Fixed and improved [Mondal et al, 2013]

## Experiments

Best depends on measure



# Conclusion

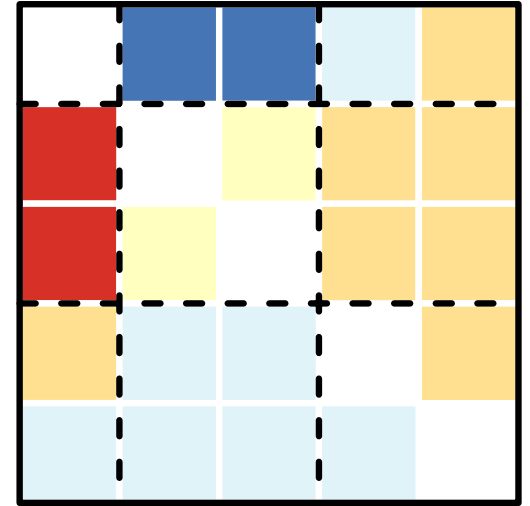
## Minimal visual complexity

Two new algorithms

Fixed and improved [Mondal et al, 2013]

## Experiments

Best depends on measure



## Future work

Closing gap for other classes

Circular arcs

Visual complexity  $\sim$  observer's assessment?

Visual complexity  $\sim$  cognitive load?



# Thank you for listening!

Wouter Meulemans <[wouter.meulemans@city.ac.uk](mailto:wouter.meulemans@city.ac.uk)>

[Van Goethem, Meulemans, Speckmann, Wood, *TVCG*, 2015]

[Igamberdiev, Meulemans, Schulz, *GD*, 2015]

[Buchin, Meulemans, Van Renssen, Speckmann, *ACM TSAS*, to appear]