



## Placing Arrows in Directed Graph Drawings



Carla Binucci<sup>1</sup>, Markus Chimani<sup>2</sup>,  
Walter Didimo<sup>1</sup>, Giuseppe Liotta<sup>1</sup>,  
Fabrizio Montecchiani<sup>1</sup>

<sup>1</sup> University of Perugia    <sup>2</sup>Osnabrück University

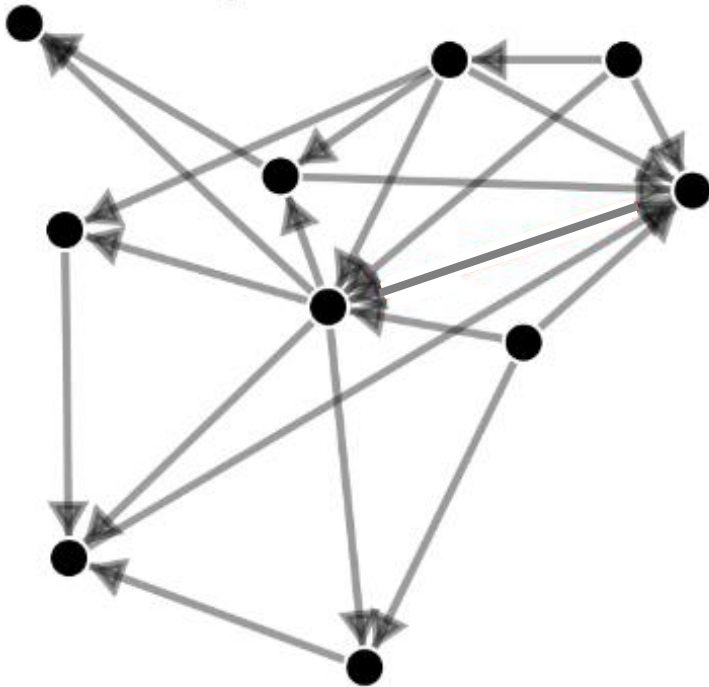
# Some preliminary considerations



- Directed graphs are used in many application domain.
- Usually a directed edge is represented as a line with an arrow head at its target.
- This is the prevailing model in software systems.

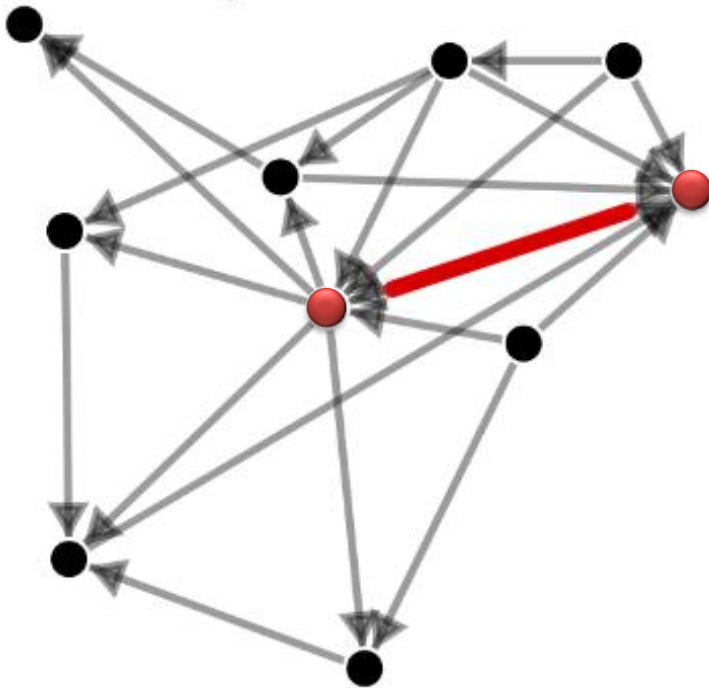
# The Problem

This simple model becomes problematic when several edges attach to a vertex on a similar trajectory



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# Our goals



Computing a placement of the arrow heads such that:

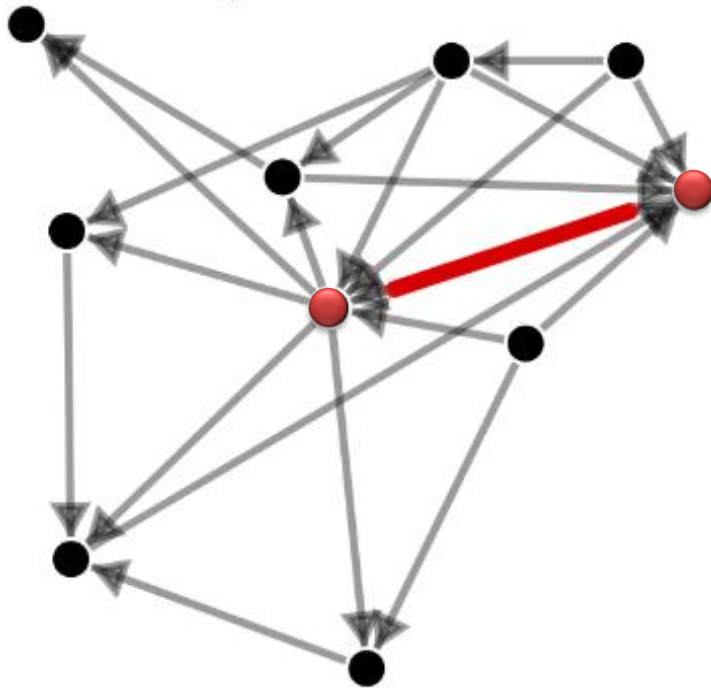
- (a) They do not overlap other edges or arrow heads.
  
- (b) They are as close as possible to the target vertices of the edges.

# Our Contribution

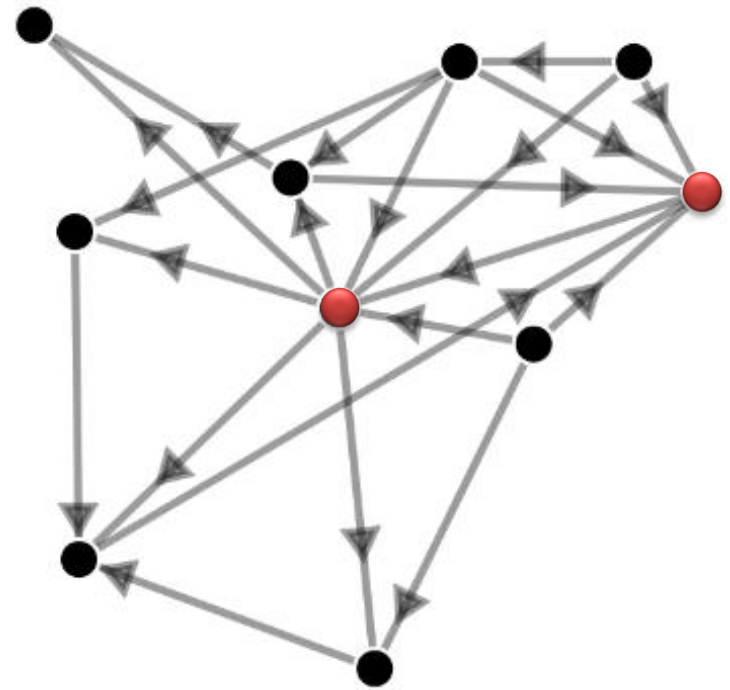
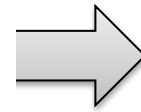


- Problem formulation & NP-hardness.
- Exact and heuristic algorithms for a discretized version of the problem.
- A preliminary experimental study.

# Example of drawings

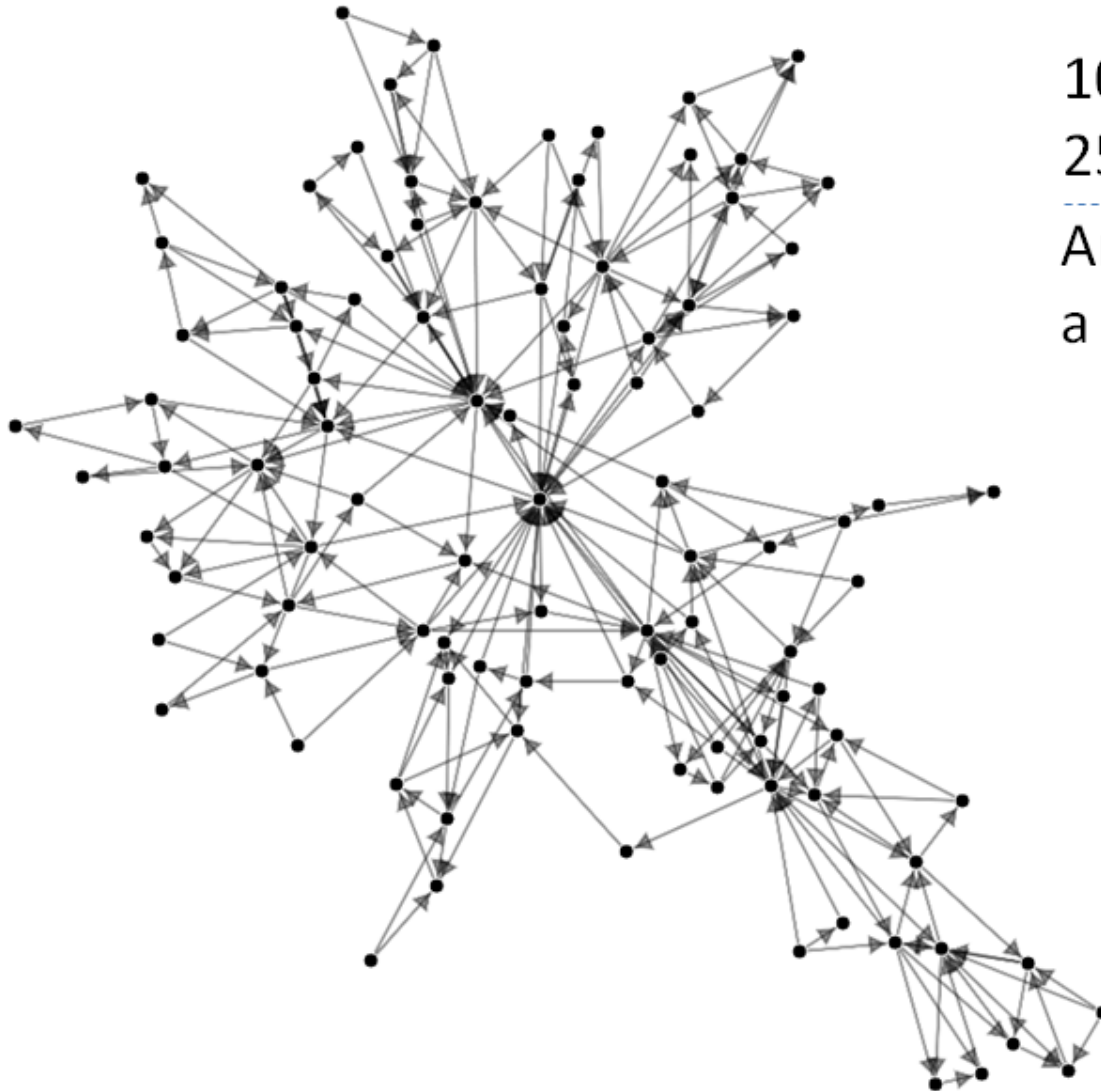


Arrows placed by  
a common editor



Arrows placed by  
our exact method

# Larger examples



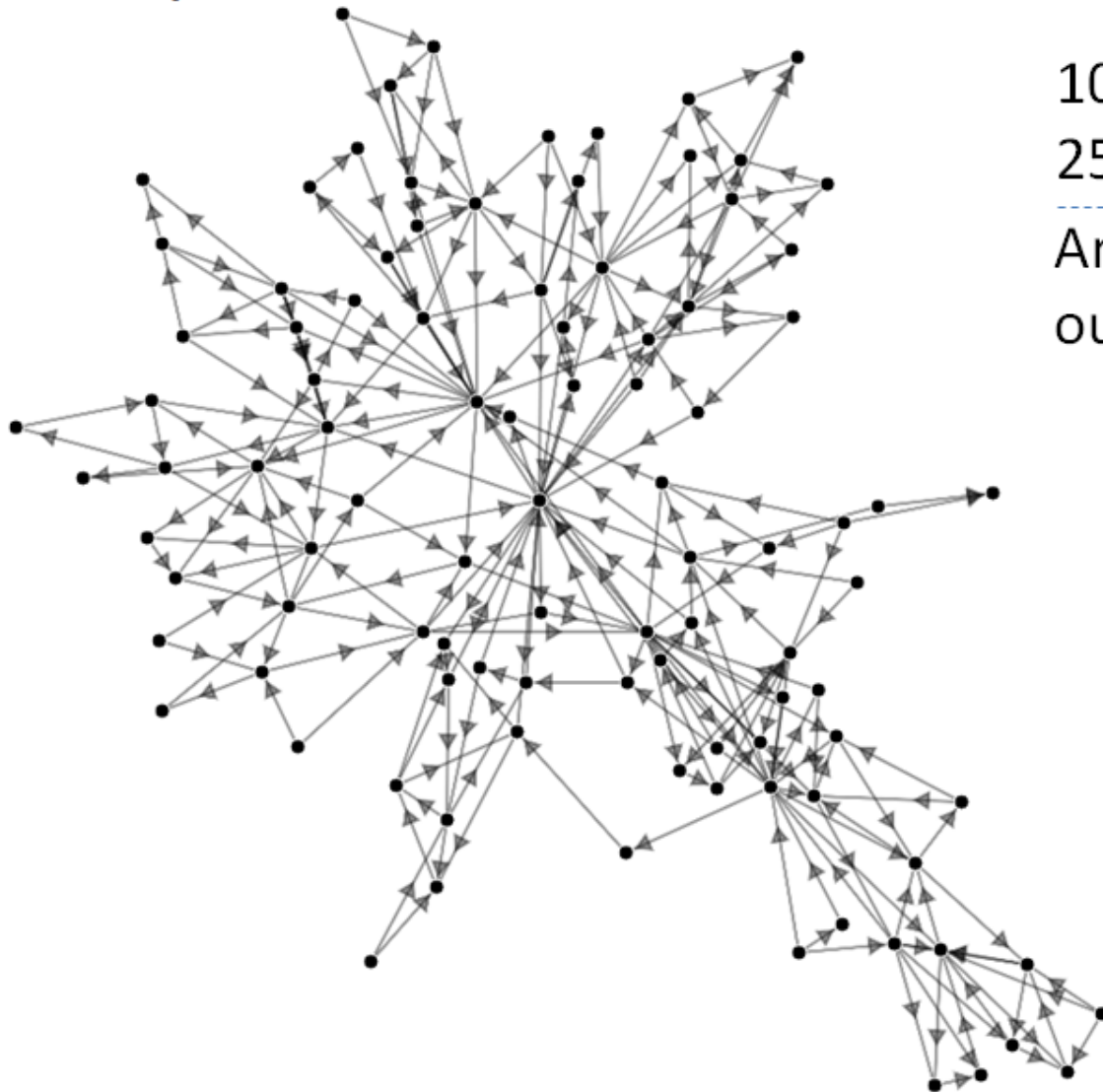
100 vertices

250 edges

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# Larger examples



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# Related Works



- User studies on the readability of directed-edge representations
  - [*Holten and van Wijk, 2009*] [*Holten et al., 2011*].
- Map labeling problems and in particular edge labeling problems
  - [*Kakoulis and Tollis, 2001, 2003, 2006, 2013*], [*Gemsa et al., 2013*], [*Gemsa et al., 2014*], [*van Kreveld et al., 1999*], [*Marks and Shieber, 1991*], [*Strijk and van Kreveld, 2002*], [*Strijk and Wolff, 2001*], [*Wagner et al., 2001*].....
- Research on this topic started at Dagstuhl with the valuable contribution of Michael Kaufmann and Dorothea Wagner
  - [*Dagstuhl seminar 15052, 2015*].

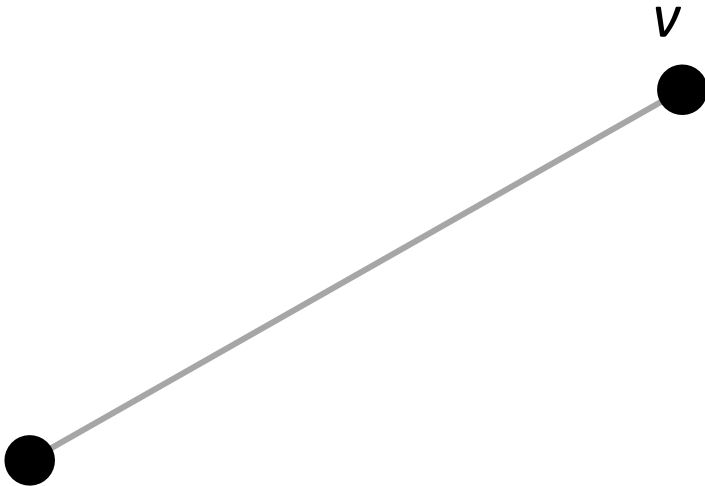
# ....In what follows....



- **Problem formulation & NP-hardness**
- Algorithms
- Experiments

# Modeling arrow heads

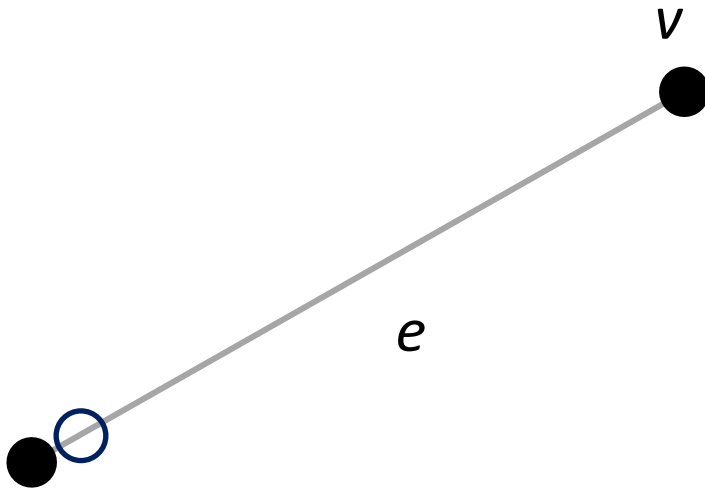
Consider a straight-line drawing  $\Gamma$  of a digraph  $G = (V, E)$ :



- Each vertex  $v$  is drawn as a circle (possibly a point).

# Modeling arrow heads

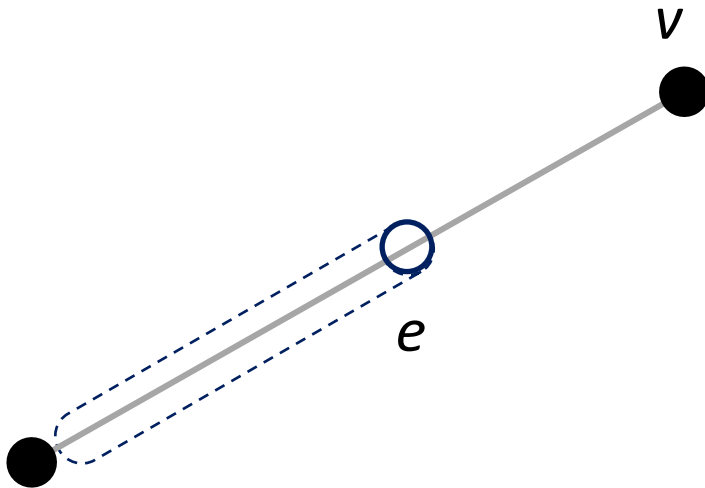
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- We model an arrow of an edge  $e$  as a circle of radius  $r_E$  centered in a point along  $e$

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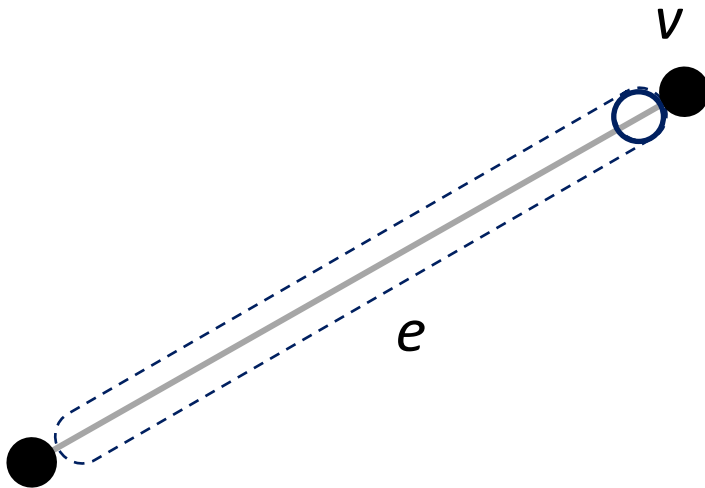
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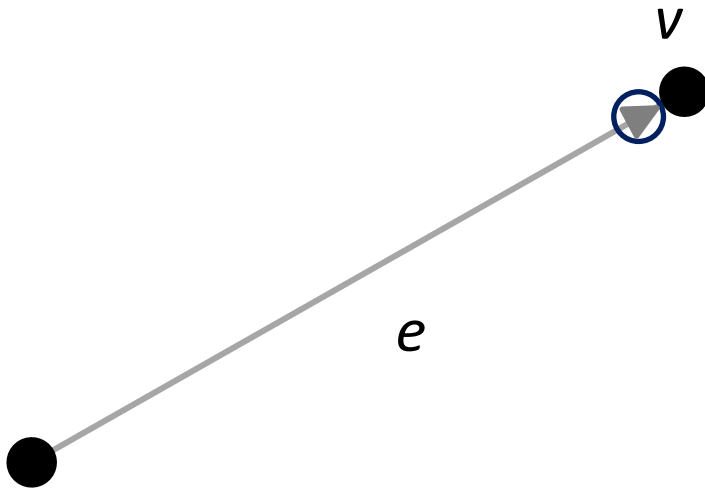
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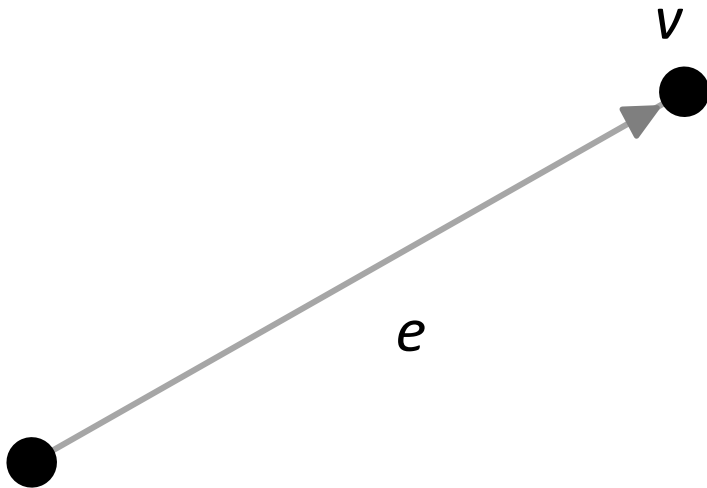


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- When  $\Gamma$  is displayed, the arrow of  $e$  is drawn as a triangle inscribed in the circle.



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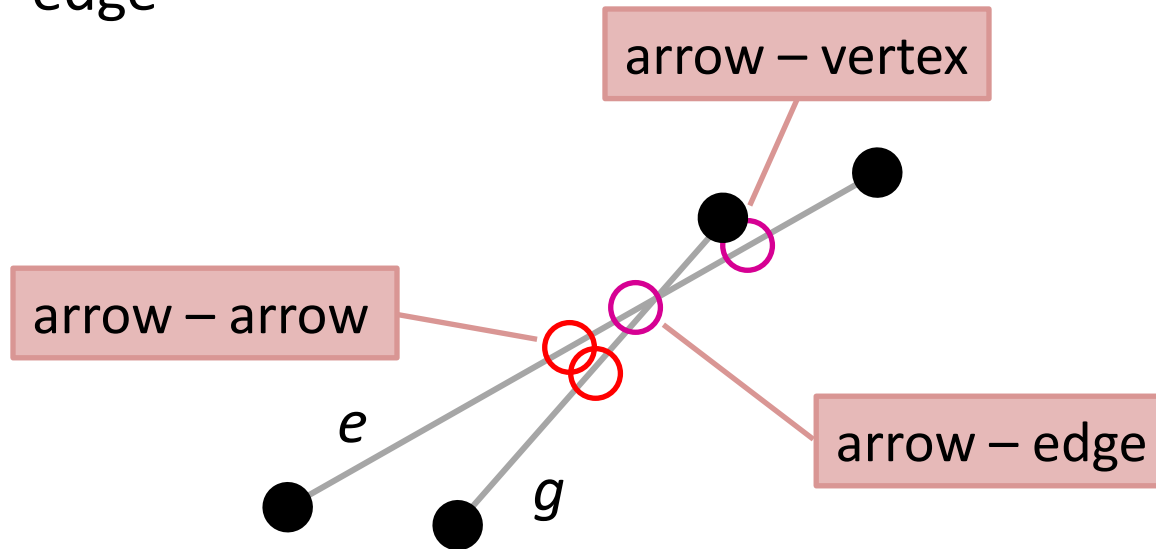


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# Overlap between objects

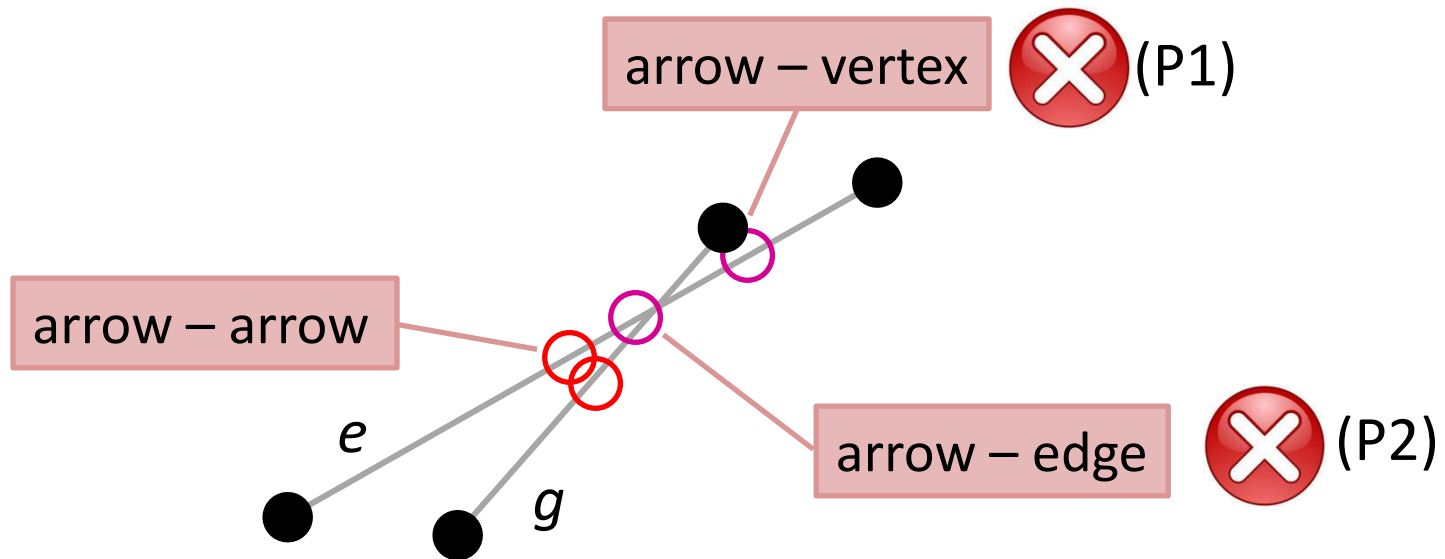
Three types of *overlap*:

- arrow – arrow
- arrow – vertex
- arrow – edge



# A valid position

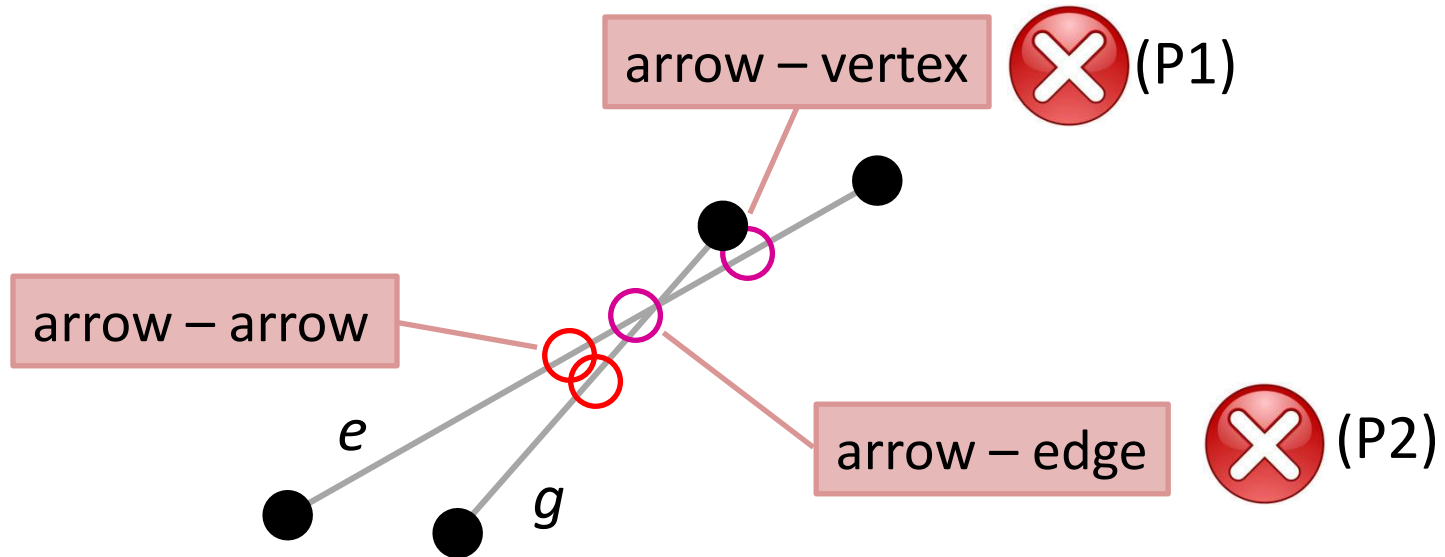
A position of an arrow of an edge  $e$  is a *valid position* if it does not overlap: (P1) any vertex  $v$ ; (P2) any edge  $g \neq e$ .



# A valid placement

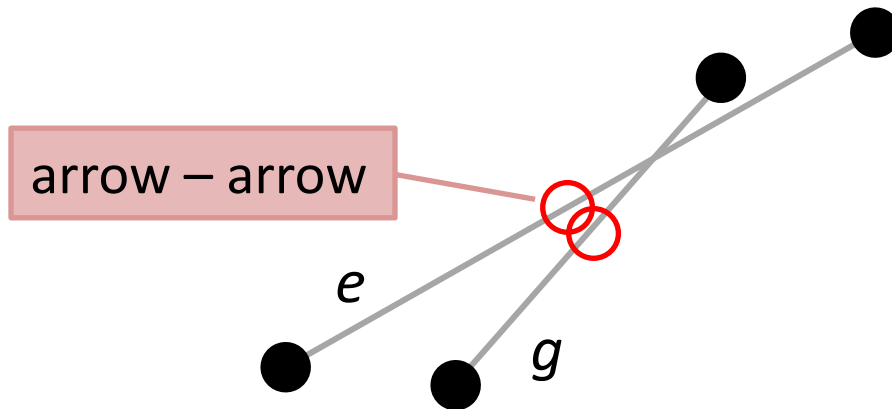
A position of an arrow of an edge  $e$  is a *valid position* if it does not overlap: (P1) any vertex  $v$ ; (P2) any edge  $g \neq e$ .

An assignment of a valid position to each arrow is called a *valid placement* of the arrows.



# Overlap number

Given a valid placement, the *overlap number* is the number of pairs of overlapping arrows.



# Arrow Placement problem



Assume that all circles representing a vertex and an arrow have a common radius  $r_V$  and  $r_E$ , respectively.

Given a straight-line drawing  $\Gamma$  of a digraph  $G = (V, E)$ , and two constants  $r_V$  and  $r_E$  compute a valid placement of the arrows (if one exists) such that the ***overlap number*** is minimum

# NP-hardness



**Theorem.** The Arrow-Placement problem is NP-hard.

The proof uses a reduction from Planar 3-SAT; the technique is similar to those used in the context of edge and map labeling [*Kakoulis and Tollis, 2001*], [*Wolff, 2000*], [*Strijk and Wolff, 2001*].

# Discrete-Arrow-Placement problem



- Arrow-Placement remains NP-hard even if we fix a finite set of valid positions for each arrow.
- We call this variant *Discrete-Arrow-Placement* problem.
- Our algorithms are designed for this variant of the Arrow-Placement problem.



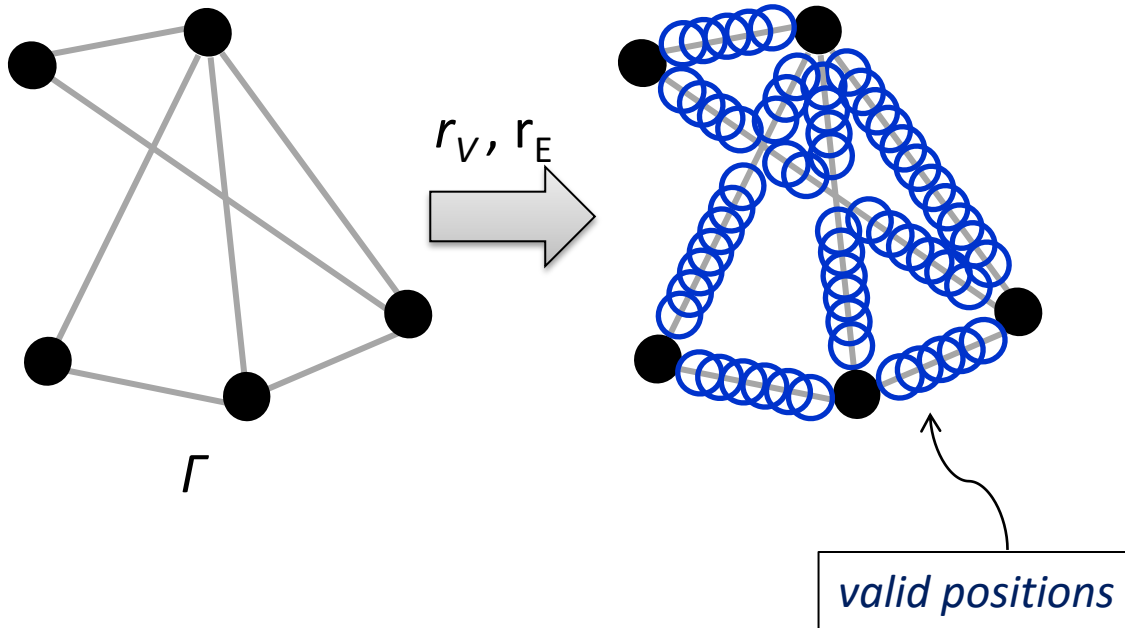
# ....In what follows....



- Problem formulation & NP-hardness
- **Algorithms**
- Experiments

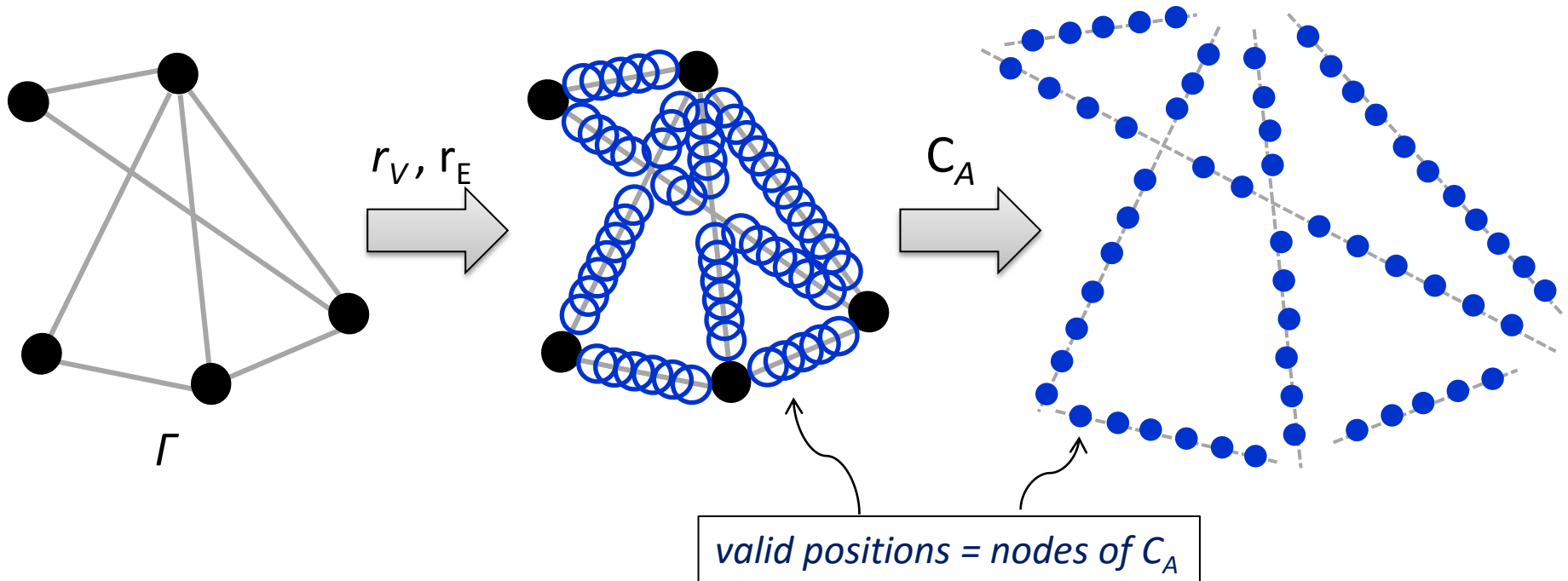
# Algorithms – basic idea

- Our algorithms are based on an *arrow conflict graph*  $C_A$ .



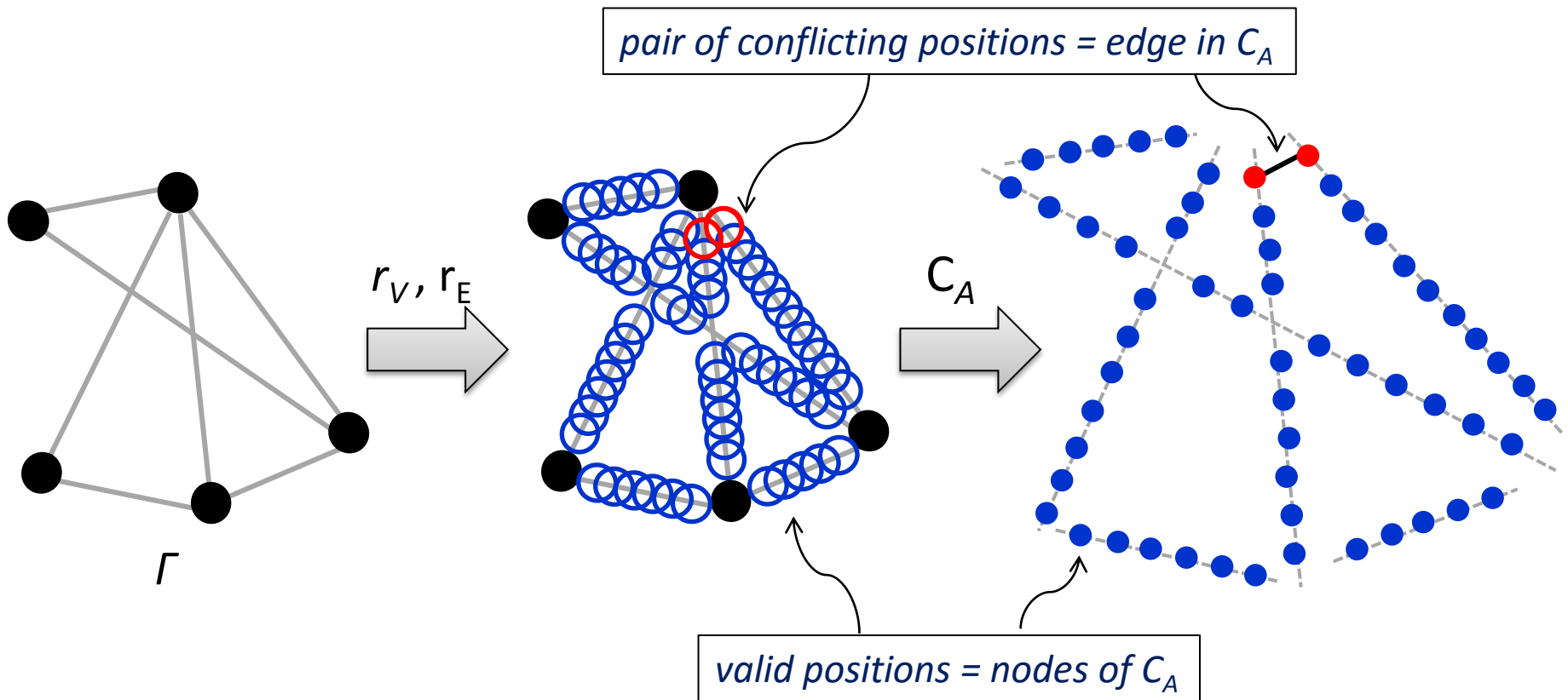
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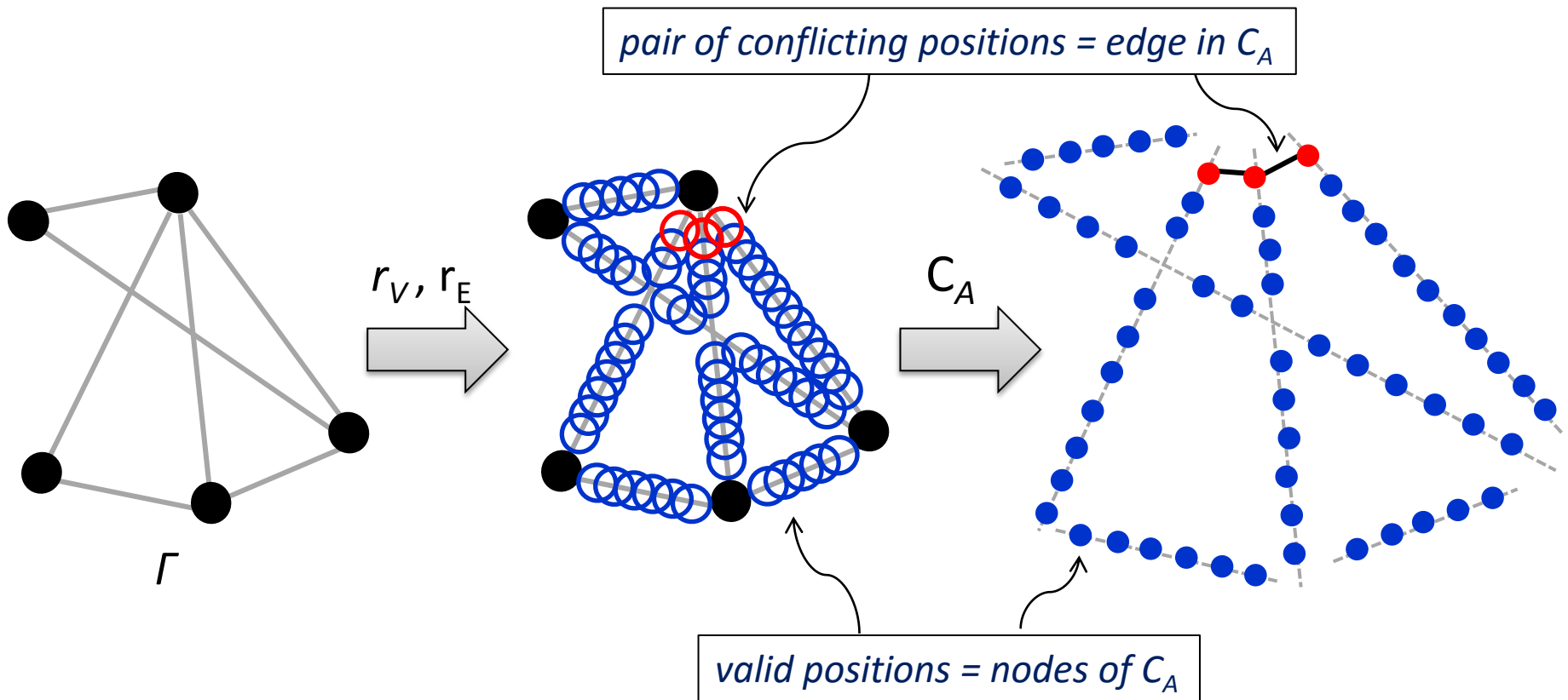
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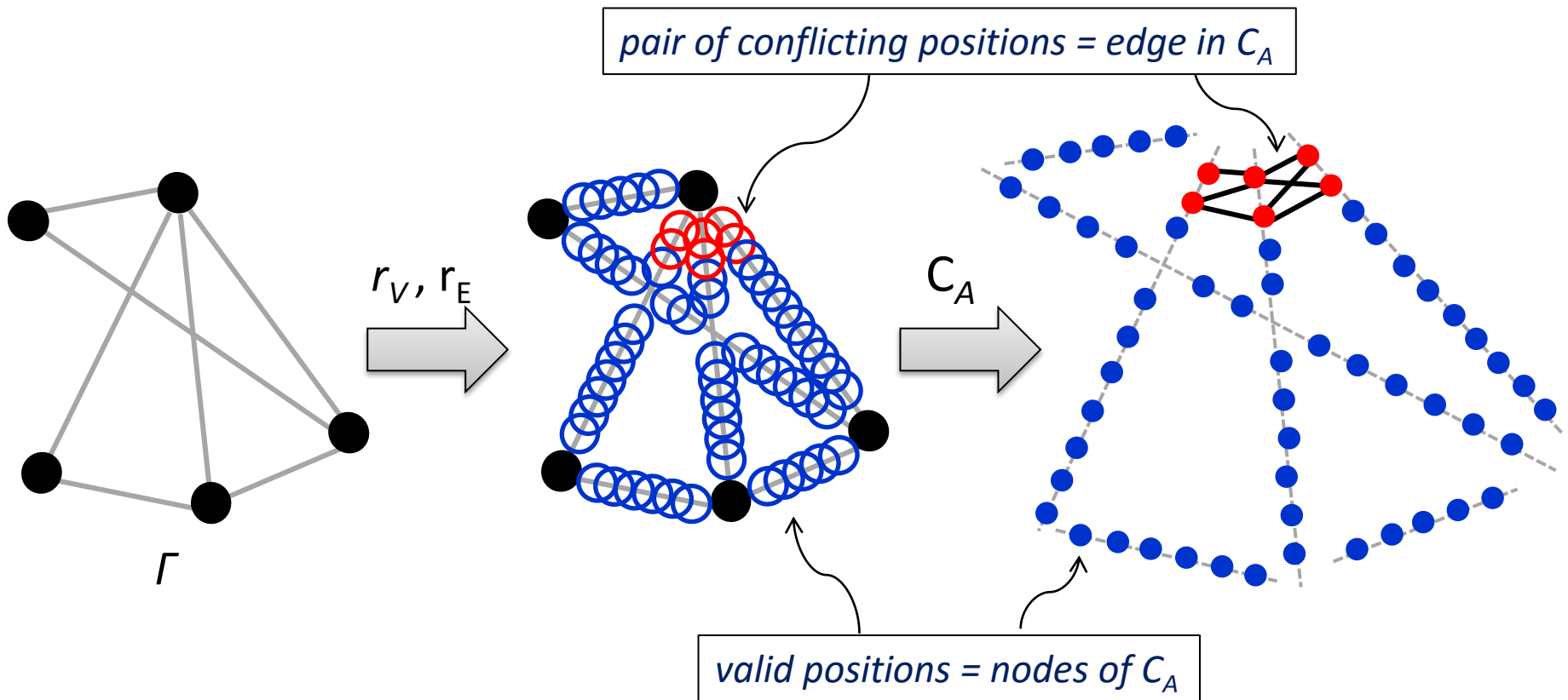
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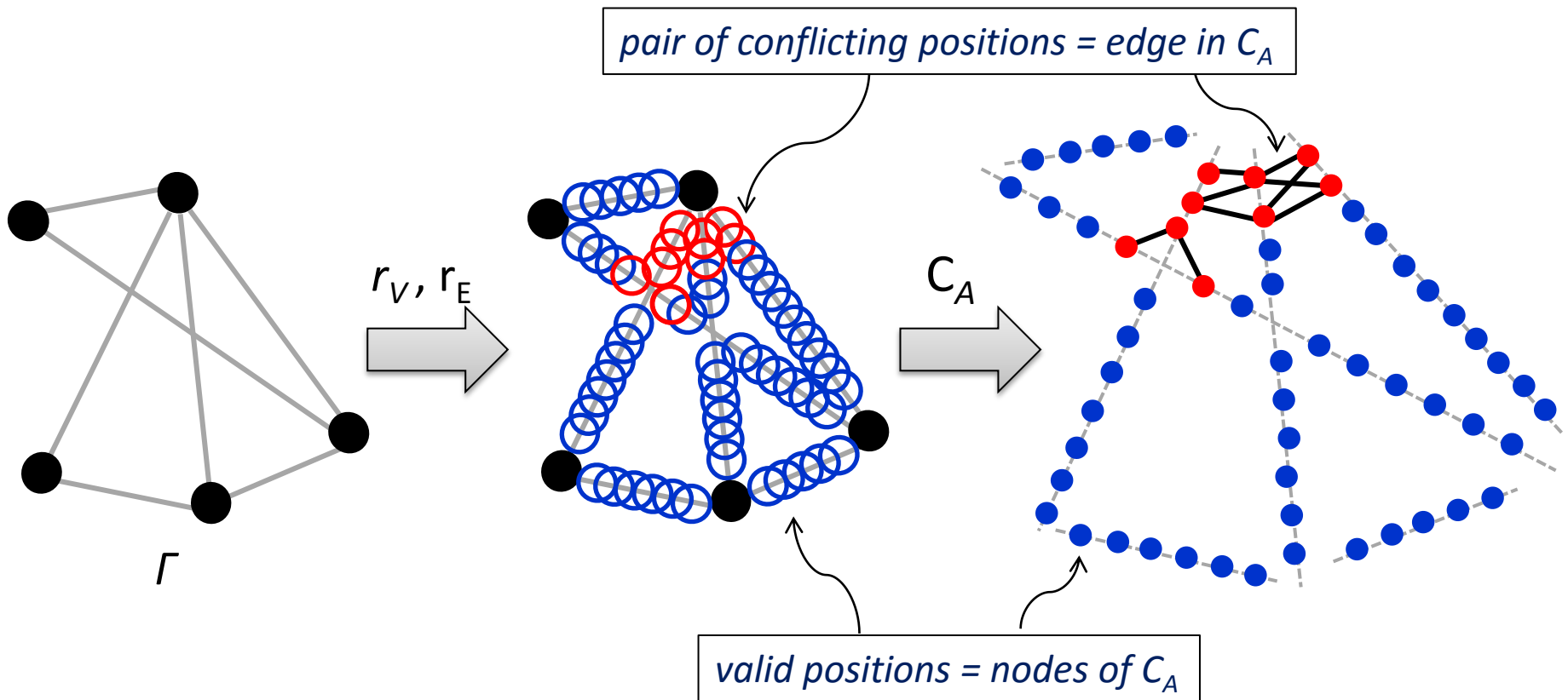
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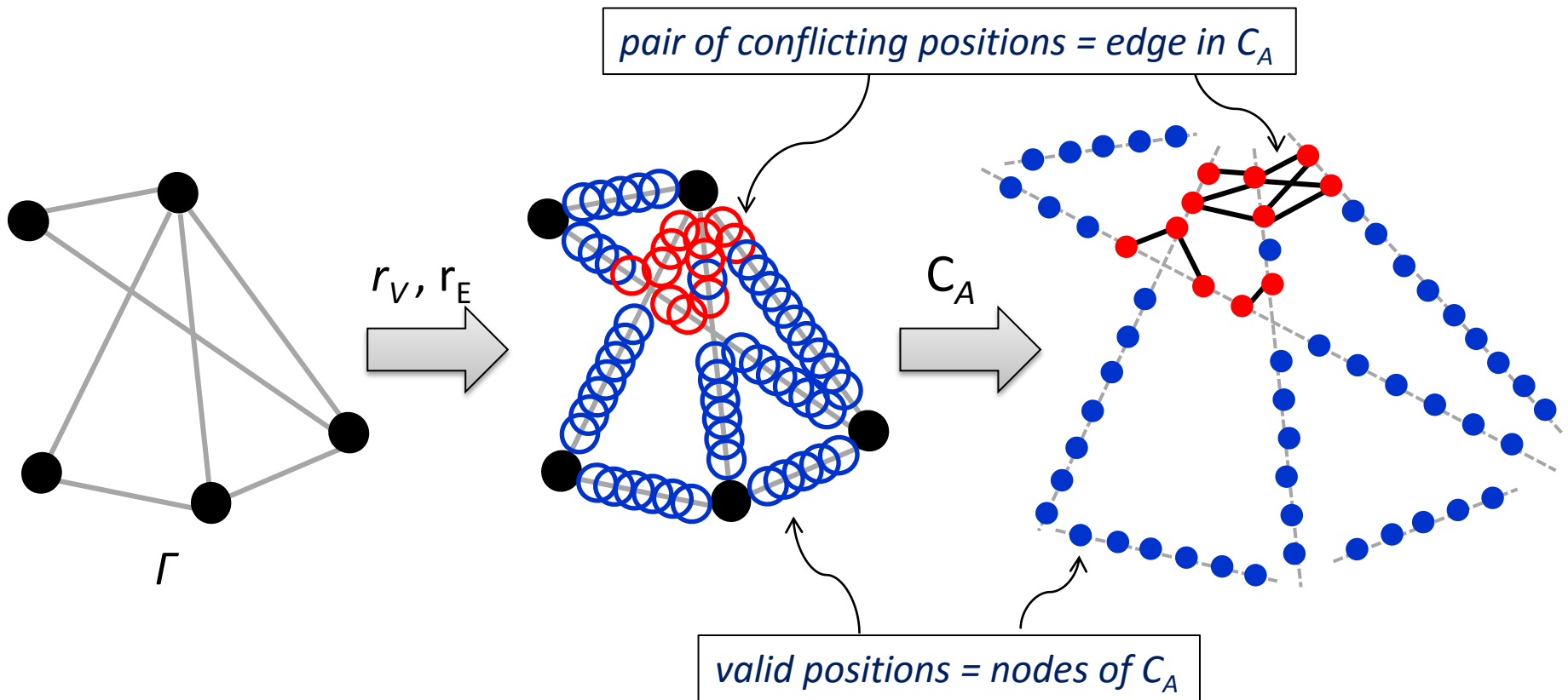
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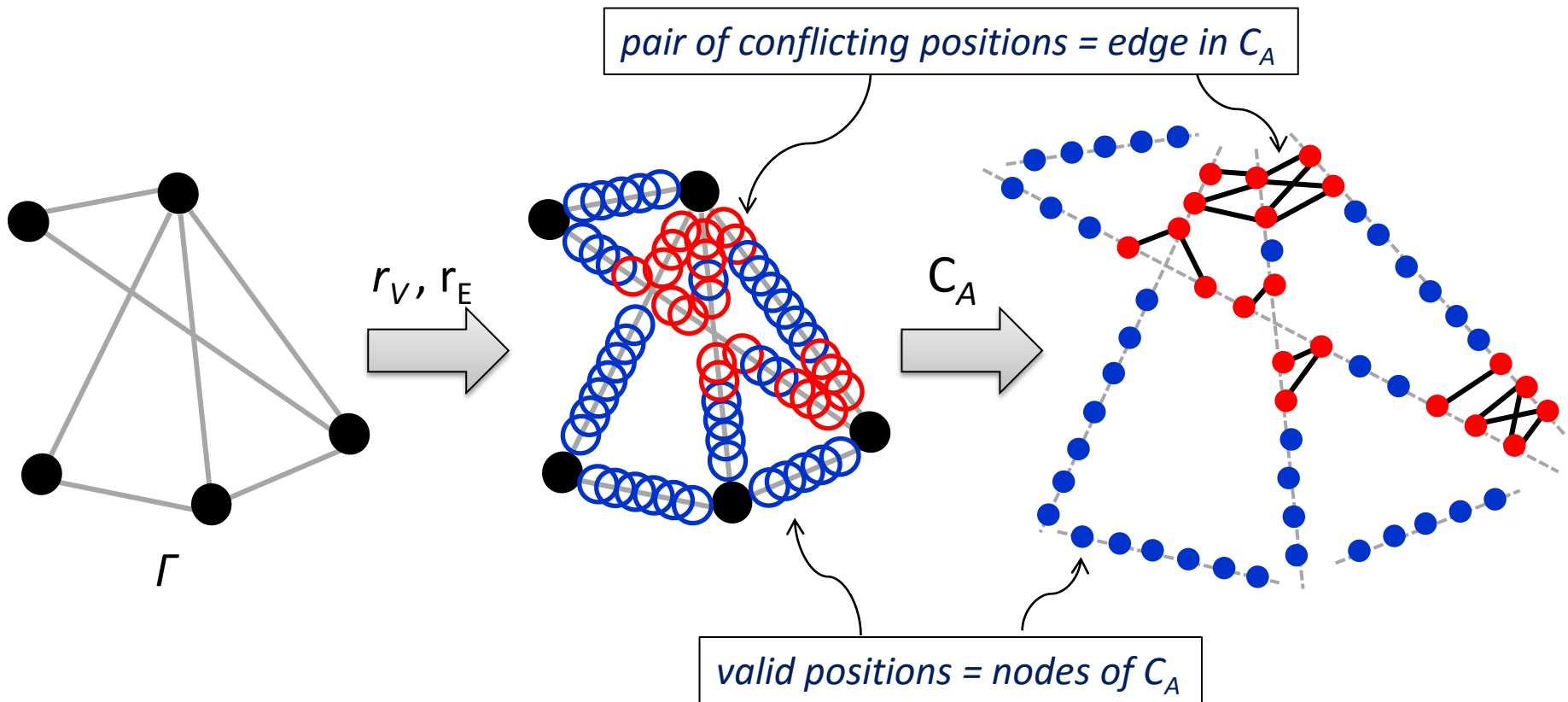
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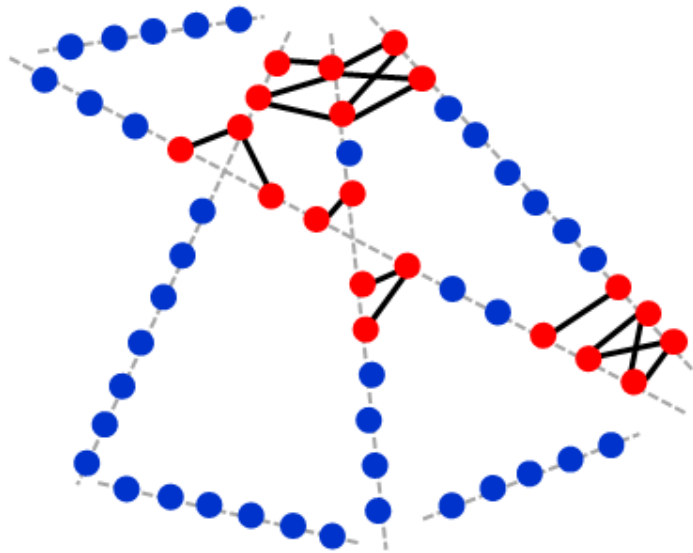


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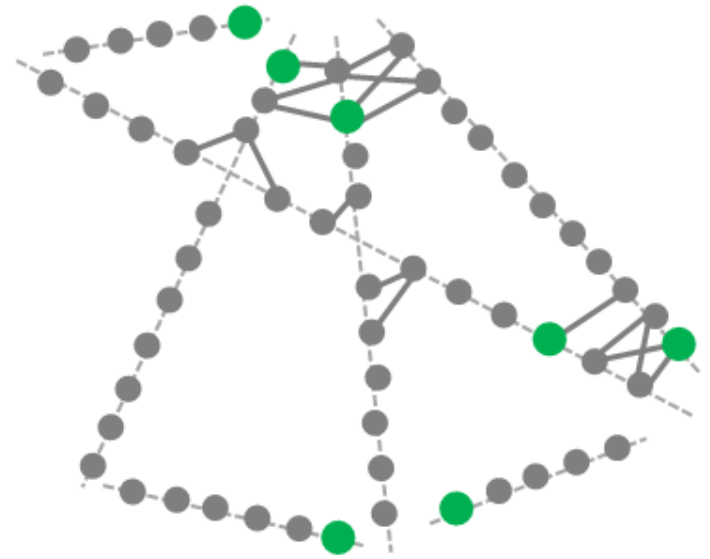
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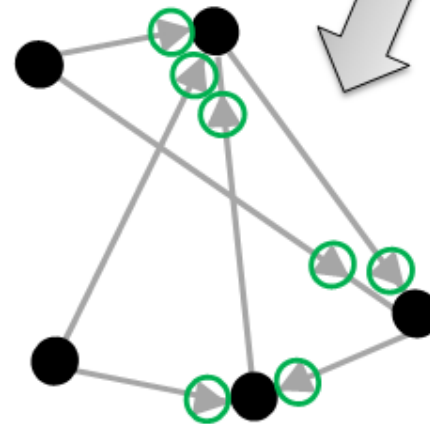
# Algorithms – basic idea



*select a valid  
position for  
each arrow*



*A valid placement  
with overlap number  
equal to zero*



# Algorithms

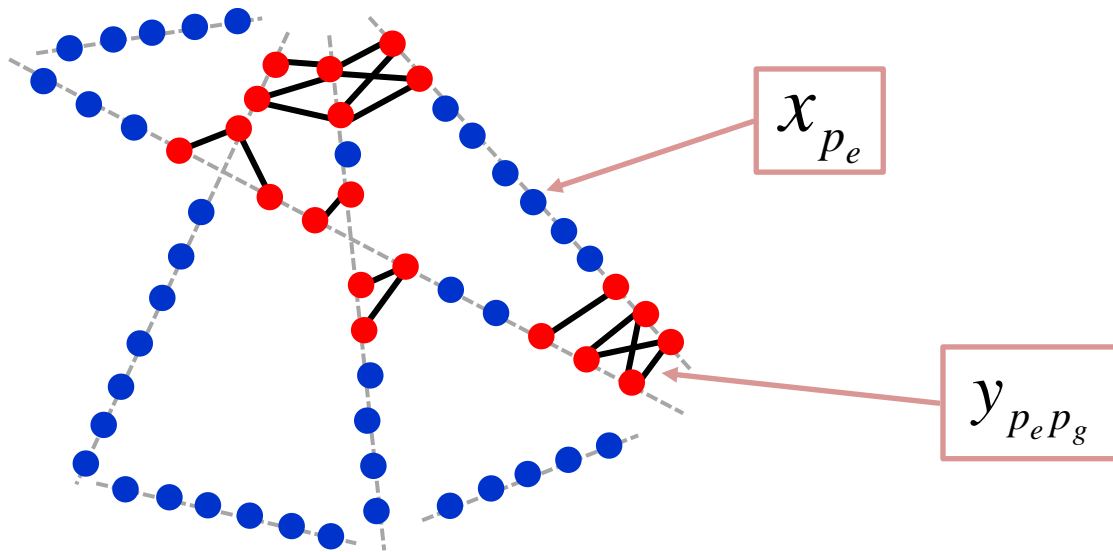


In general, we compute a valid placement with minimum number of overlaps.

- Our exact algorithm uses an ILP formulation.
- Our heuristic adopts a greedy strategy.
  - Both techniques try to minimize the distance of each arrow from its target vertex as a secondary objective.

# ILP formulation - variables

- A binary variable  $x_{p_e}$  for each valid position  $p_e$
- A binary variable  $y_{p_e p_g}$  for each edge  $(p_e, p_g)$  of  $C_A$



- The total number of variables is  $O(|A|^2)$

# ILP formulation



distance of  $p_e$   
from the target

$$\min \sum_{(p_e, p_g) \in E(C_A)} y_{p_e p_g} + \frac{1}{M} \cdot \sum_{e \in E} \sum_{p_e \in A_e} d(p_e) x_{p_e}$$

$$\sum_{p_e \in A_e} x_{p_e} = 1 \quad \forall e \in E$$

$$x_{p_e} + x_{p_g} \leq y_{p_e p_g} + 1$$

$$\forall (p_e, p_g) \in E(C_A)$$

# Heuristic



Our heuristic follows a greedy strategy, based on  $C_A$ .

- We associate a cost  $c(p_e)$  with each position  $p_e$ , and then execute  $|E|$  iterations.
- In each iteration:
  - select a position  $p_e$  of minimum cost and place the arrow of the corresponding edge there;
  - remove all positions of edge  $e$  from  $C_A$  and update the costs of the remaining positions.

# Heuristic – cost function



$$c(p_e) = \delta(p_e) + \frac{1}{M} \cdot d(p_e) + T \cdot \sigma_{p_e}$$

Number of positions  
conflicting with  $p_e$

Distance of  $p_e$   
from the target.

Number of already chosen  
positions that conflict with  $p_e$

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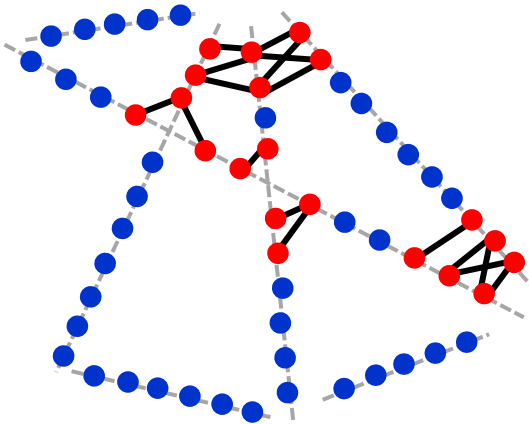
Number of already chosen  
positions that conflict with  $p_e$

- Positions with minimum number of conflicts and closer to the target vertex, are preferred.
- Positions conflicting with already placed arrows are chosen only if necessary.

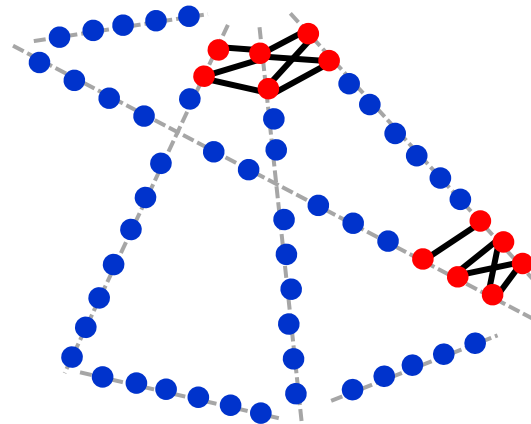


# Heuristic - two variants

- Constructing  $C_A$  may be time-consuming in practice. We also considered a simplified version of  $C_A$ .




full  $C_A$



simplified  $C_A$

- **HEURGLOBAL** is the heuristic that considers full  $C_A$ .
- **HEURLOCAL** is the variant based on the simplified version of  $C_A$ .

# ....In what follows....

- 
- Problem formulation & NP-hardness
  - Algorithms
  - **Experiments**

# Experimental settings - Test suite



- **PLANAR**: biconnected planar digraphs with edge density 1.5–2.5

- **RANDOM**: digraphs with edge density 1.4–1.6 (generated with uniform probability distribution).

- 30 instances each;  
- 6 graphs for each number of vertices  $n \in \{100, 200, \dots, 500\}$ .

- **NORTH**: a set of 1,275 real-world digraphs with 10–100 vertices and average density 1.4.

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- Drawing algorithm: OGDF's FM<sup>3</sup> algorithm [*Hachul and Jünger, 2004*].

# Invalid positions



- If an edge has no valid positions we enforce it to have a unique (*invalid*) position for the arrow, the position closest to its target vertex.
- In the final placement there might be some **crossings** between an arrow and a vertex or an edge.

# Measures



- **Running time.**
- **Placement time** (the time spent to find a placement after  $C_A$  has been computed).
- **Overlap number.**
- **Number of crossings** (due to invalid positions).

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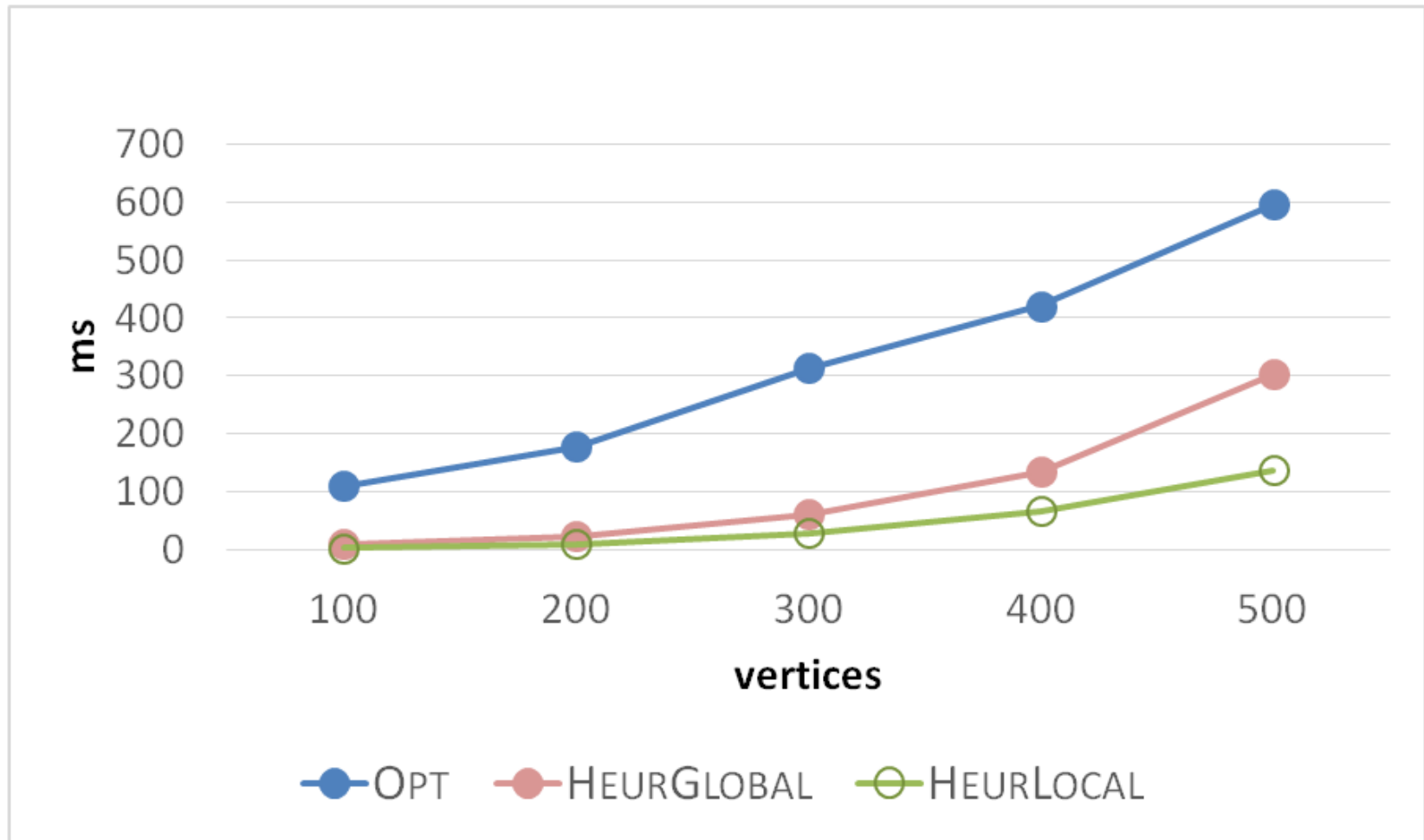
We compared our algorithms also with a trivial algorithm **EDITOR** which simply places each arrow close to its target vertex.

# Major findings

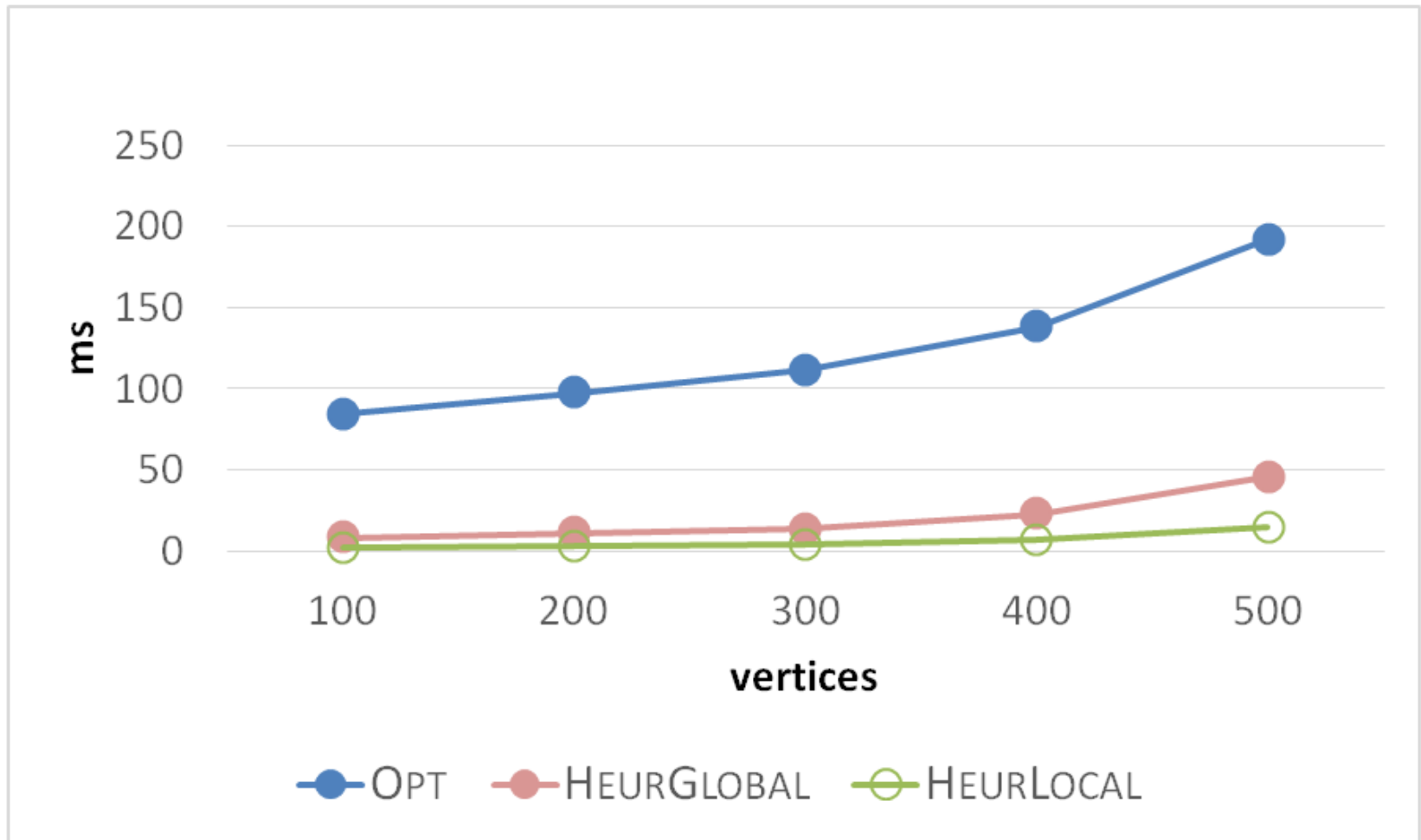


- The algorithms are efficient in practice (less than one second); the optimum (OPT) is the slowest.
- The placement time of HEURGLOBAL and HEURLOCAL are similar. 1/3 of the overall running time is taken from the construction of  $C_A$ . The construction of the simplified version of  $C_A$  is negligible.
- HEURGLOBAL almost coincides with the optimum in terms of overlaps. HEURLOCAL also gives very good solutions.
- Our algorithms reduce the number of invalid positions and produce significantly less crossings than EDITOR.

# PLANAR – Running Time

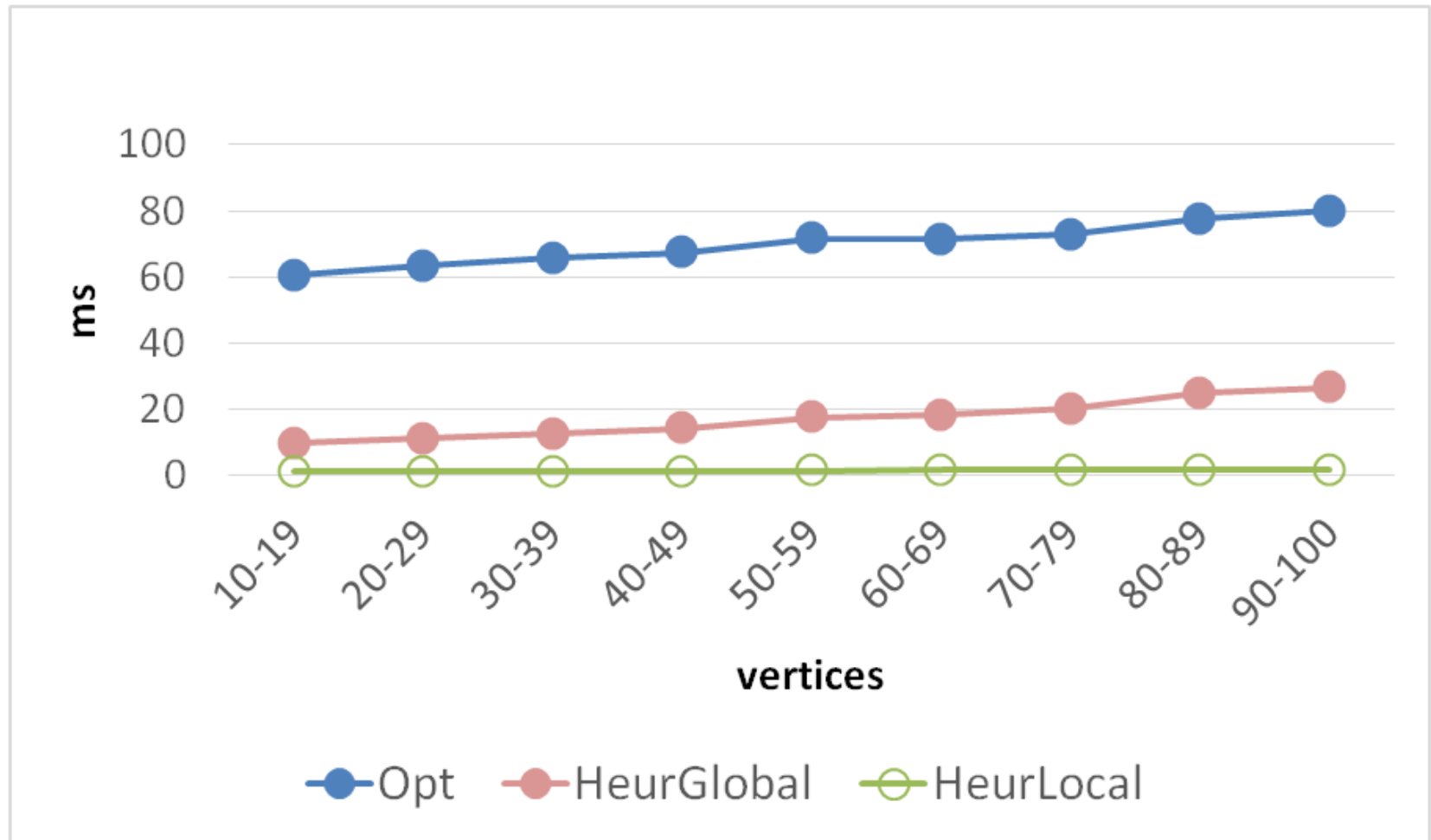


# RANDOM – Running Time

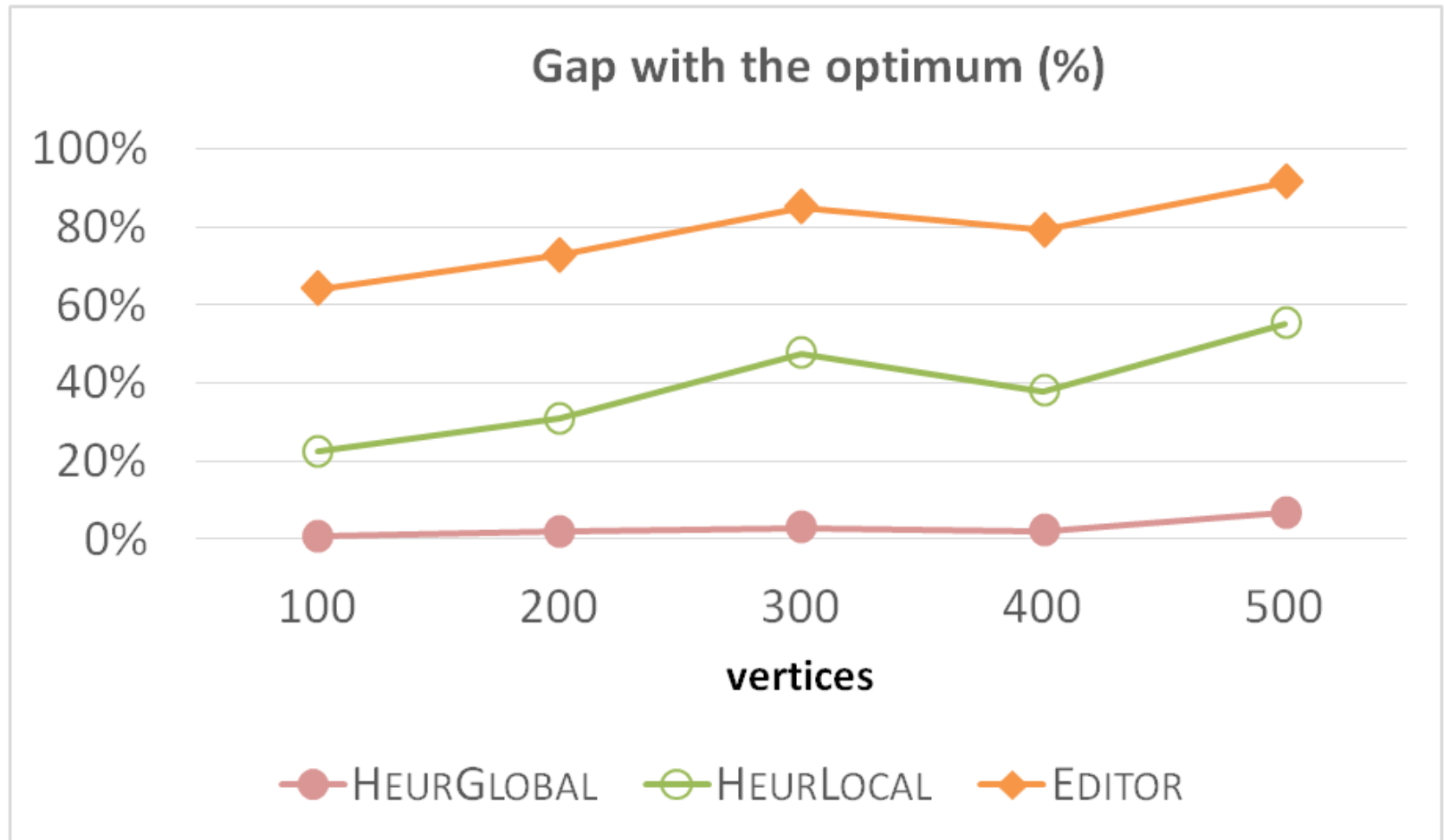




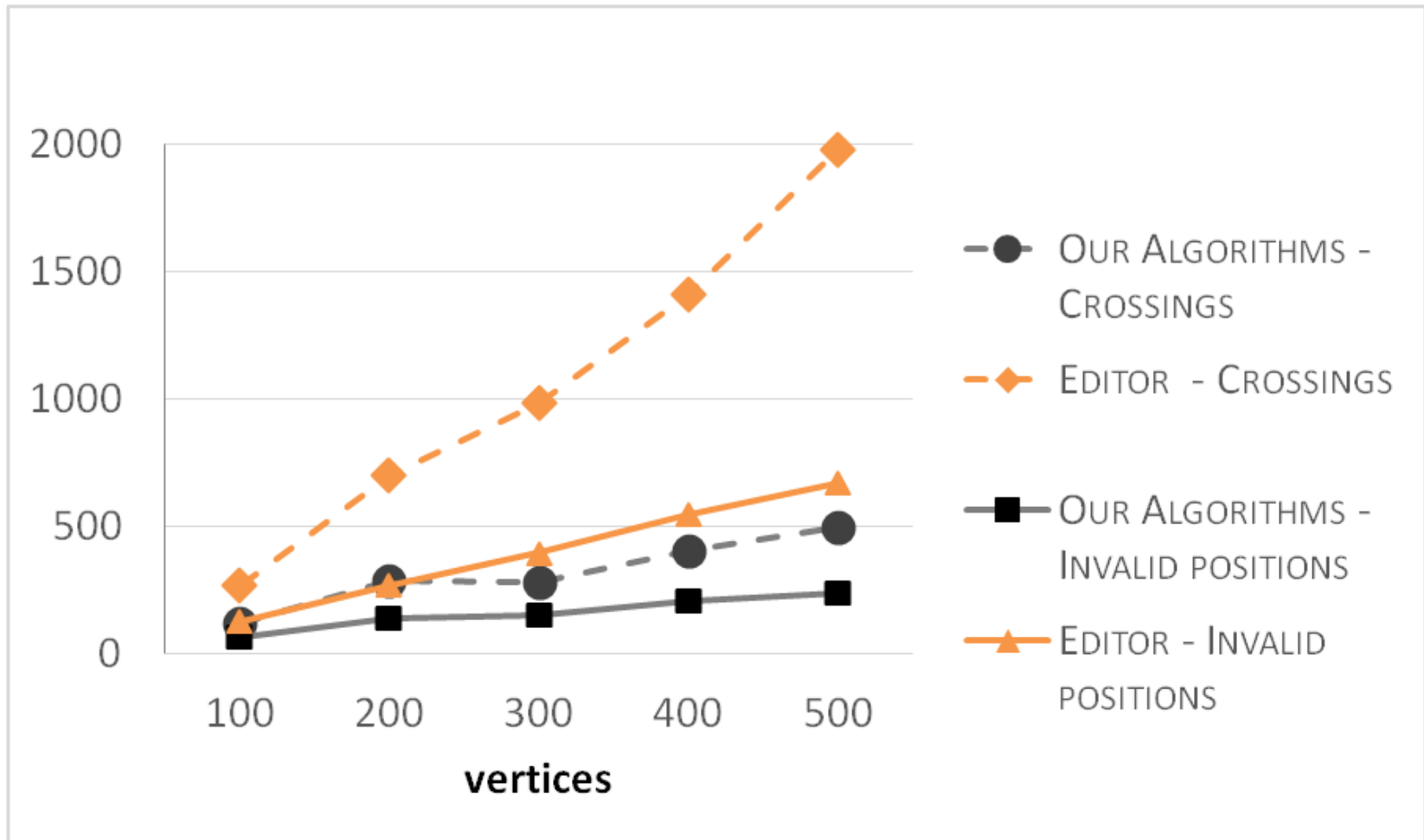
# NORTH – Running Time



# PLANAR – Overlap number



# PLANAR – Crossings & invalid positions



# Scalability of our techniques



- We extended both Planar and Random sets with 30 larger instances each (6 graphs for each number of vertices  $n \in \{600, 700, \dots, 1000\}$ ).
- The behavior of our algorithms is similar to that reported for smaller instances:
  - The algorithms are still fast (less than two second).
  - HEURGLOBAL almost coincides with the optimum in terms of overlaps.
  - Our algorithms still generate significantly less crossings than EDITOR.
  - Constructing  $C_A$  remains the most expensive step.

# Future work



- Speed-up our techniques for constructing  $C_A$  using a sweepline or the labeling techniques in [*Wagner et al., 2001*].
- Validate the effectiveness of our approach through a user study (e.g. for tasks that involve path recognition).
- Consider both placing labels and arrow heads.
- Investigate the non-discretized problem variant, both from a practical and theoretical point of view.

*Thank you!*

