

# **Star-Struck by Fixed Embeddings Modern Crossing Number Heuristics**

GD '21

Joint work with Markus Chimani and Tilo Wiedera

Max Ilse, University of Osnabrück

September 15, 2021

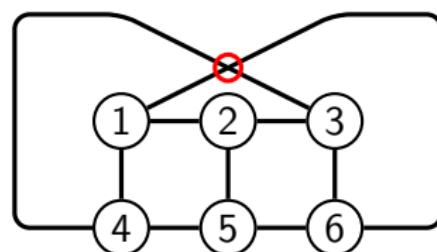
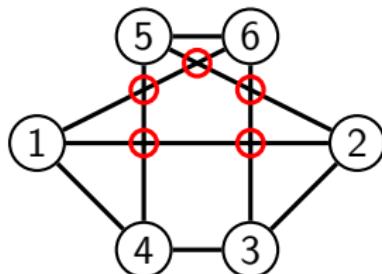
[max.ilsen@uos.de](mailto:max.ilsen@uos.de)

# Crossing Number Problem

- o Motivation
- Algorithms
- Evaluation
- Conclusion

**Given:** Graph  $G$

**Task:** Find minimum number of edge crossings in any drawing of  $G$

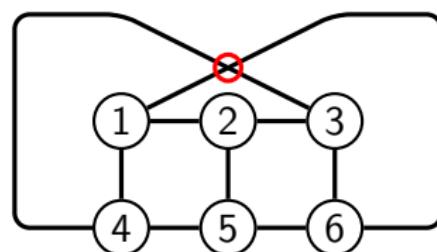
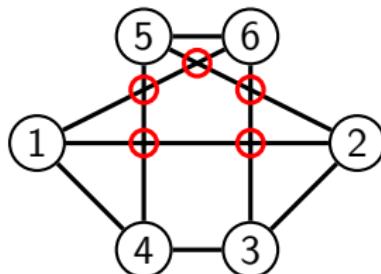


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NP-hard even in restricted settings  
→ Let's evaluate some heuristics!

# Planarization Method

## Heuristic #1

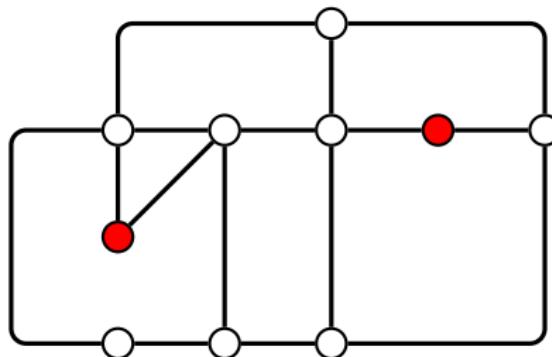
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◦ Algorithms

Evaluation

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→ compute planar subgraph, insert remaining edges iteratively



# Planarization Method

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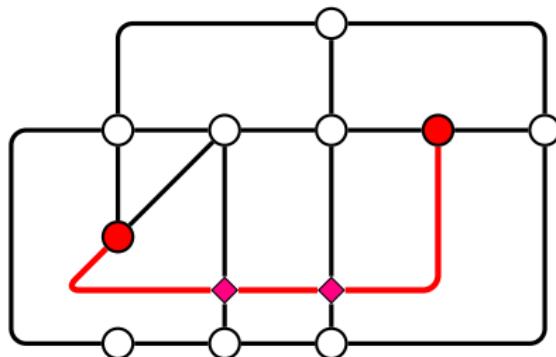
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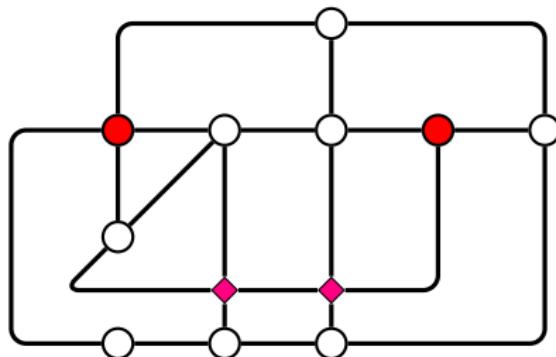


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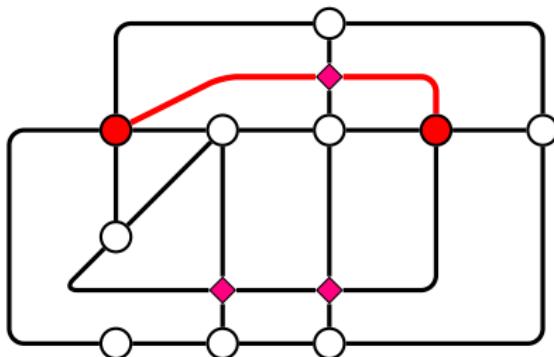


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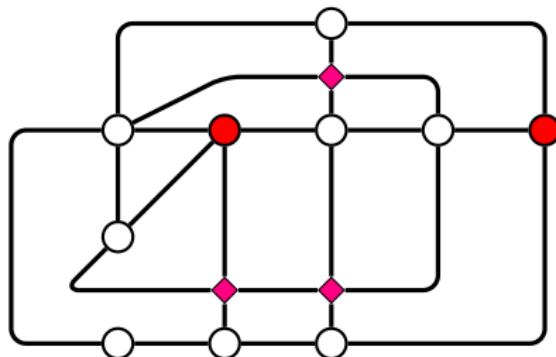
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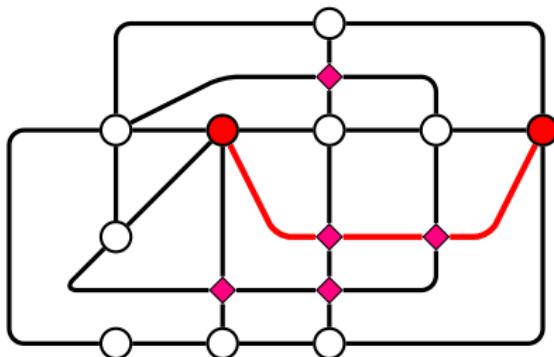


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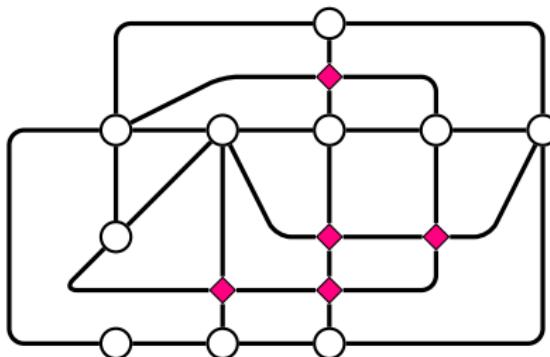


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### Edge Insertion:

- fixed embedding (Batini, Talamo, and Tamassia 1984)
- variable embedding (Gutwenger, Mutzel, and Weiskircher 2005)
- multiple edge insertion (Chimani and Hlinený 2011)

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### Post-Processing:

- **all**: remove and reinsert every edge at the end  
(Gutwenger and Mutzel 2003)
- **inc**: perform **all** after each edge insertion  
(Chimani and Gutwenger 2012)

# Chordless Cycle Method

## Heuristic #2

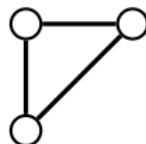
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→ compute chordless cycle, insert partial stars connected to it



# Chordless Cycle Method

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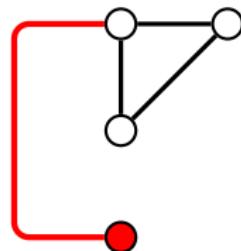
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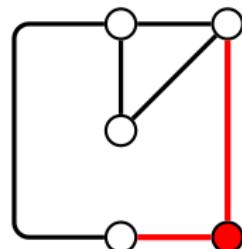
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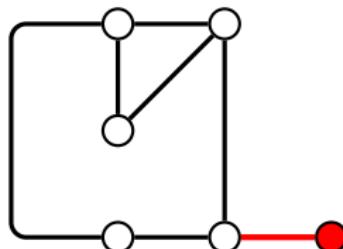
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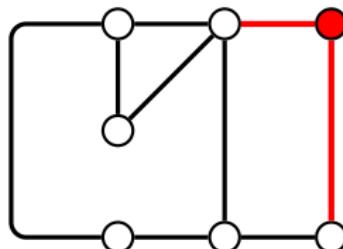
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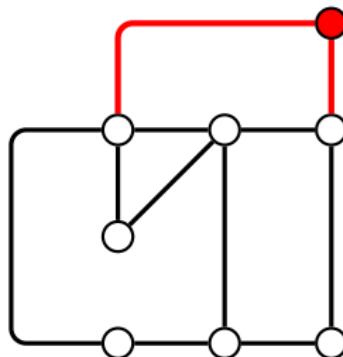


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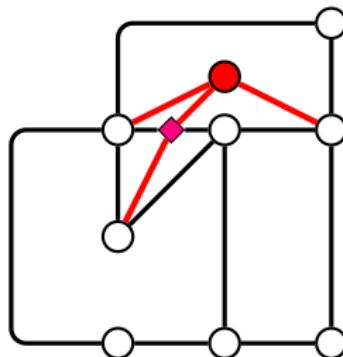


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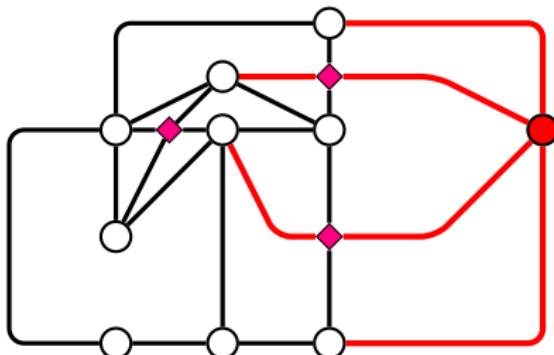
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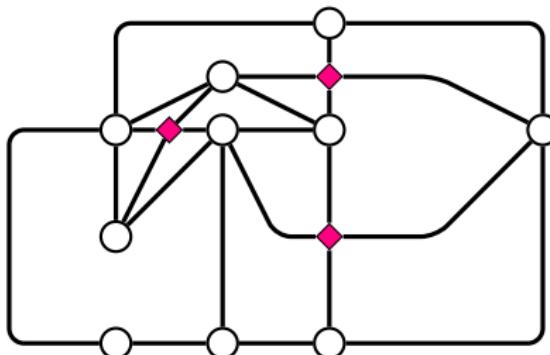


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# Star Insertion (Fixed Embedding)

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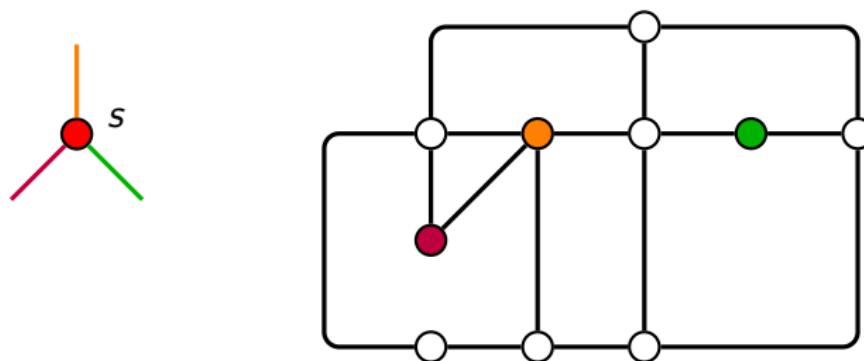
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**Given:** Planar graph  $G$ , embedding  $\Pi$  of  $G$ , star  $s$  not yet in  $G$

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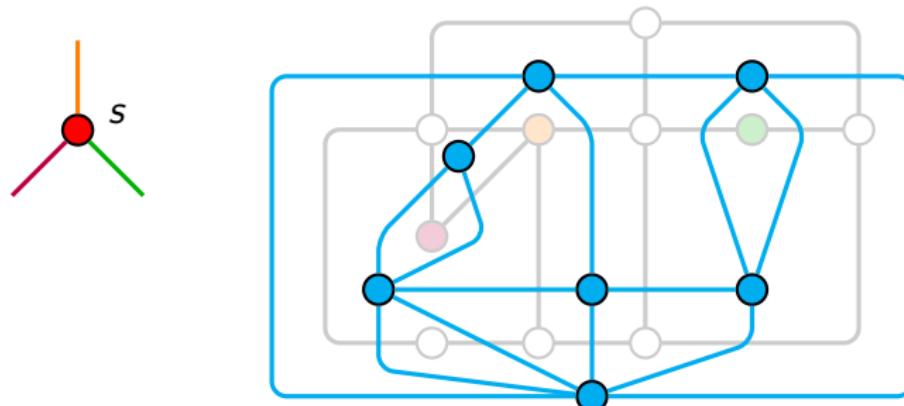
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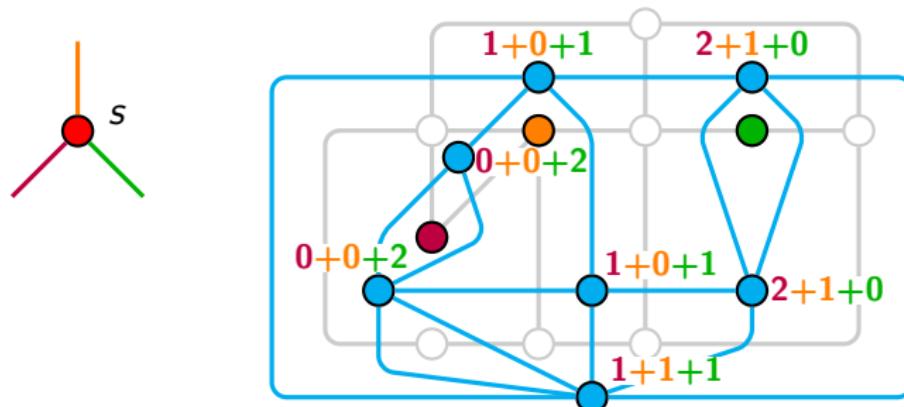


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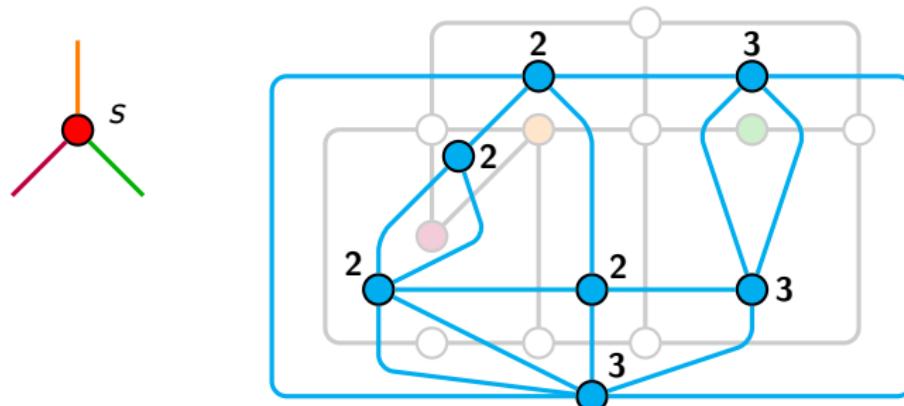


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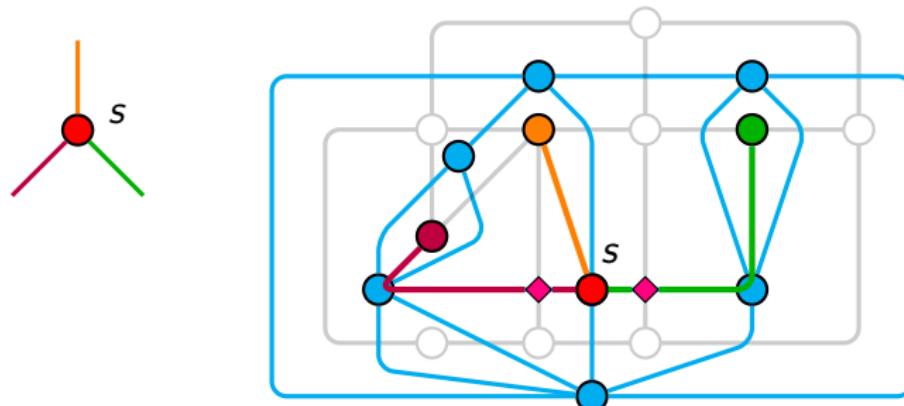
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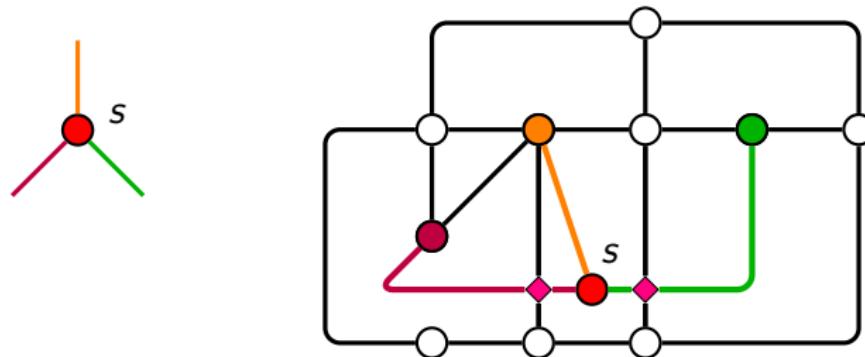
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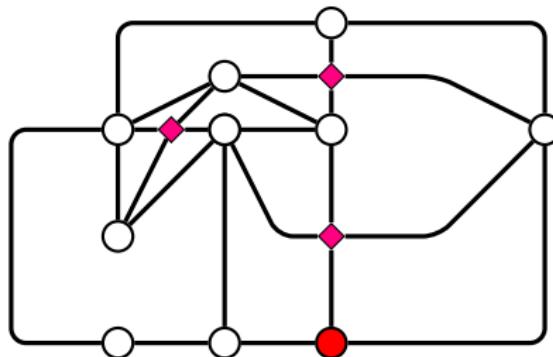


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## Post-Processing

Motivation  
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→ create initial planarization, remove and reinsert stars until no reinsertion can decrease number of crossings

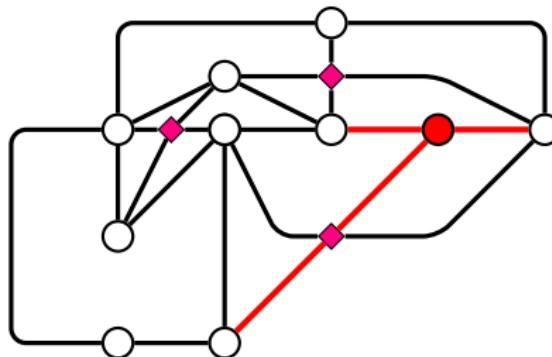


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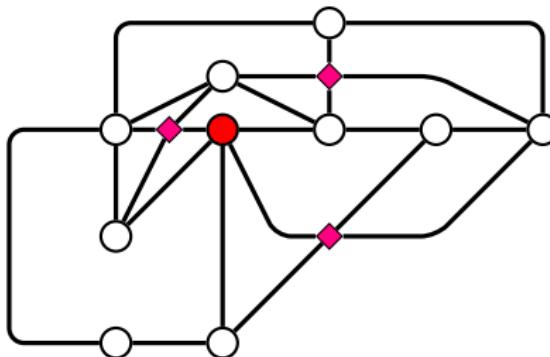


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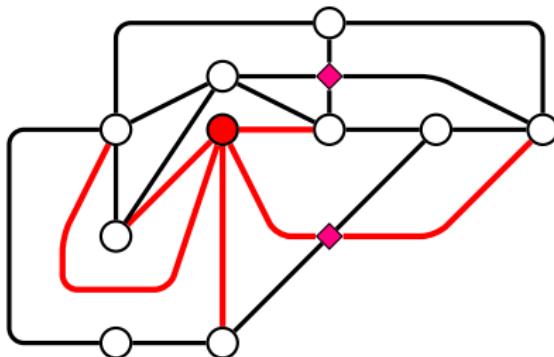


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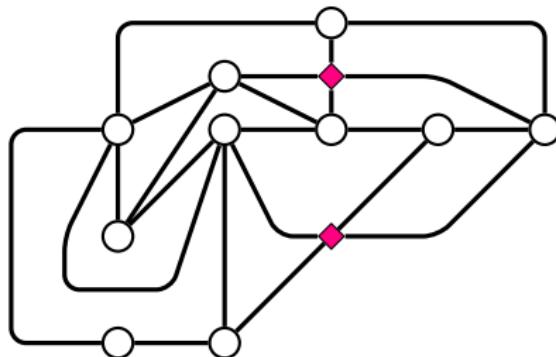


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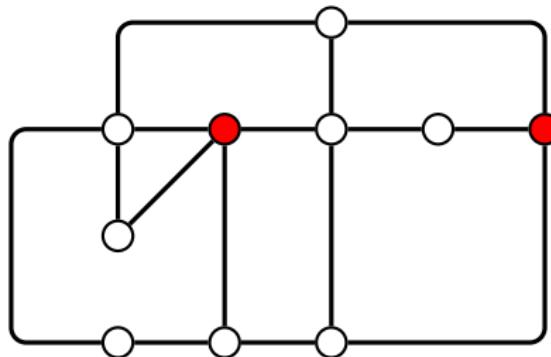


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## Heuristic #3: Our Own Approach

Motivation  
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→ compute planar subgraph, insert remaining edges via star insertion of their endpoints (if possible)

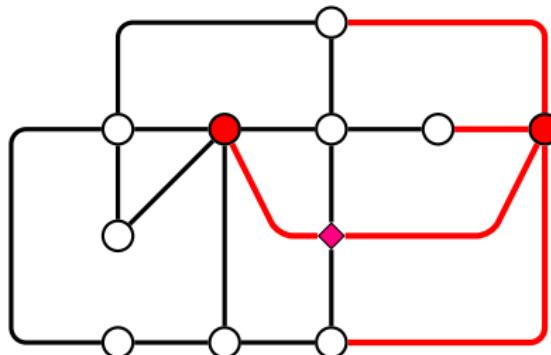


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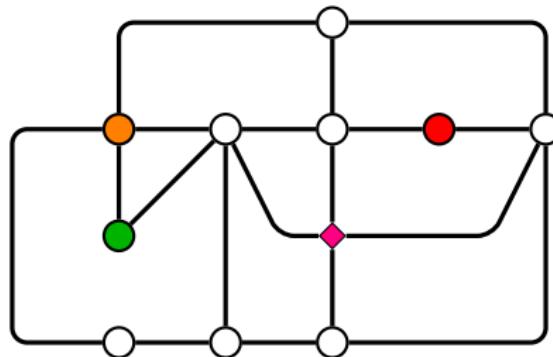


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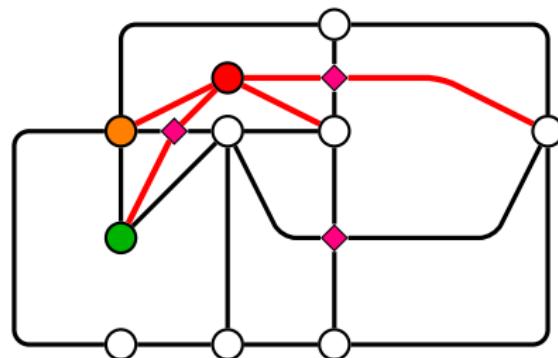


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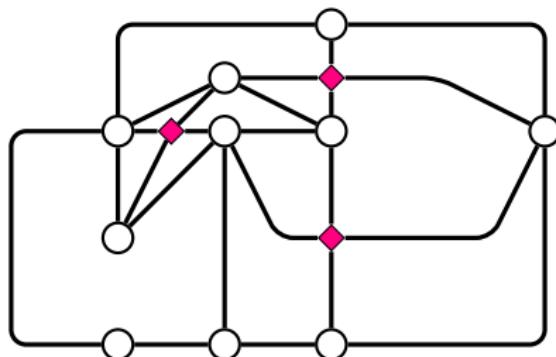
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## Setup:

- C++ (GCC 8.3.0), Open Graph Drawing Framework (OGDF)
- single physical processor of a Xeon Gold 6134 CPU (3.2 GHz)
- memory limit of 4 GB, no time limit

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<sup>1</sup>Chimani and Gutwenger 2009

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## Pre-Processing:

- non-planar core reduction<sup>1</sup>
- precomputed planar subgraph and chordless cycle

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<sup>1</sup>Chimani and Gutwenger 2009

# Instances

Motivation  
Algorithms  
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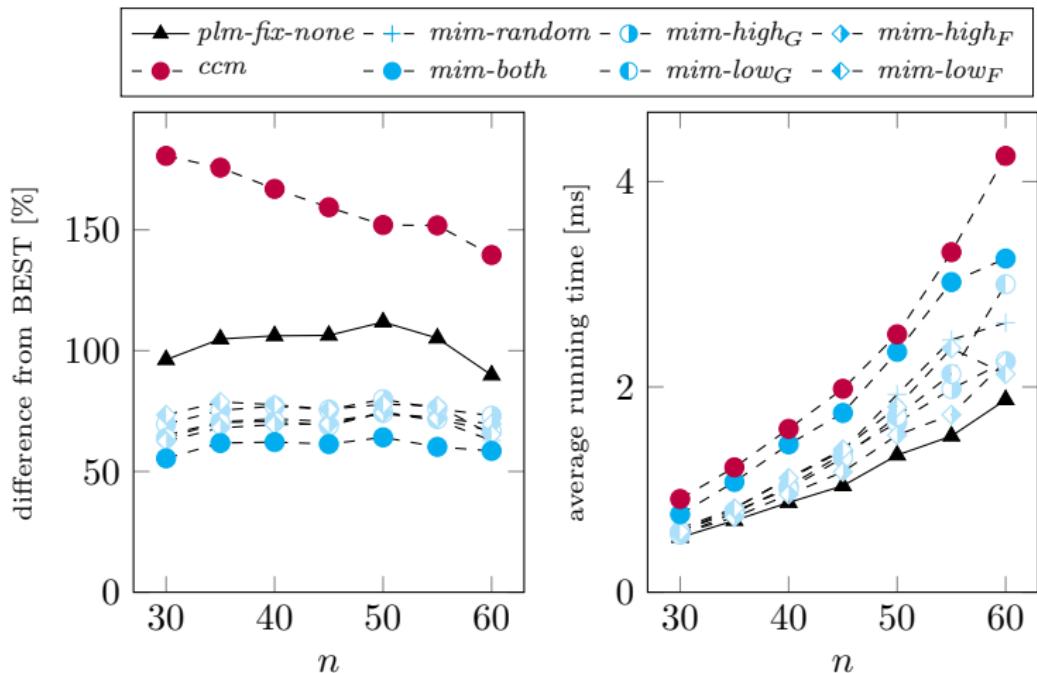
$\geq 25$ vertices in NPC		
Name	#	$ V(G) $
<b>Rome</b>	3668	25–58
<b>North</b>	106	25–64
<b>Webcompute</b>	75	25–112
<b>Expanders</b>	240	30–100
<b>Circuit-Based</b>	45	26–3045
<i>ISCAS-85</i>	9	180–3045
<i>ISCAS-89</i>	24	60–584
<i>ITC-99</i>	12	26–980

all instances		
Name	#	$ V(G) $
<b>Complete</b>	46	5–50
<b>Complete-Bip.</b>	666	10–80
<b>KnownCR</b>	1946	9–250
$C \square C$	251	9–250
$G \square P$	893	15–245
$G \square C$	624	15–250
$P(., .)$	178	10–250

# Fast Heuristics

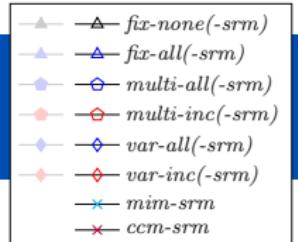
## Rome

Motivation  
Algorithms  
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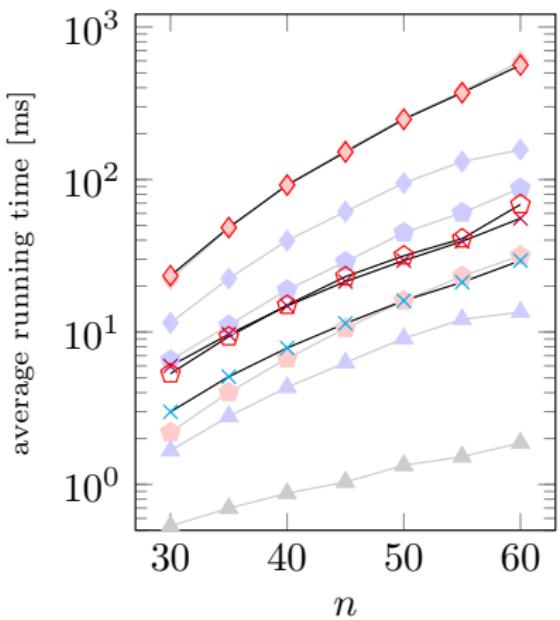
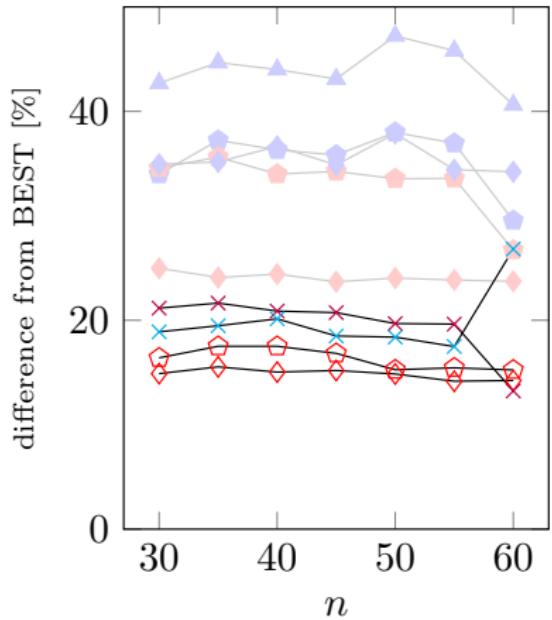


# Star Reinsertion Method

Rome



Motivation  
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# Conclusion

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- ***srm*-post-processing** improves all heuristics

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- **permutations** useful for heuristics with *srm*-post-processing
- easy improvements via removal of **non-simple crossings**

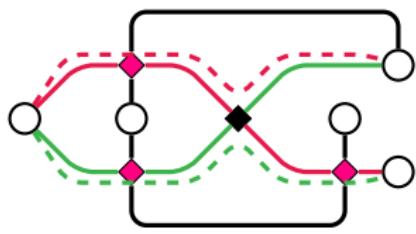
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**Thank you! Any questions?**

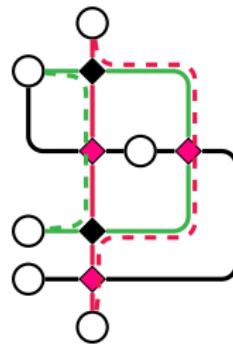
# Non-simple Crossings

## Removal

- Motivation
- Algorithms
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- Conclusion



**$\alpha$ -crossing**  
adjacent edges

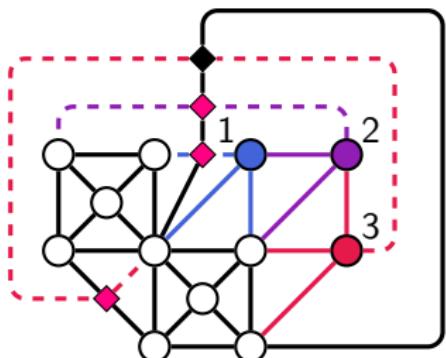


**$\beta$ -crossing**  
two edges, multiple crossings

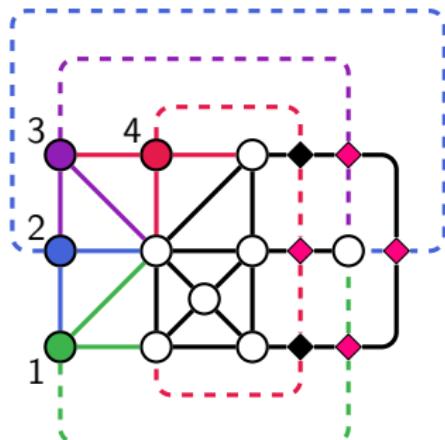
# Non-simple Crossings

## Creation

Motivation  
Algorithms  
Evaluation  
o Conclusion



**$\alpha$ -crossing**



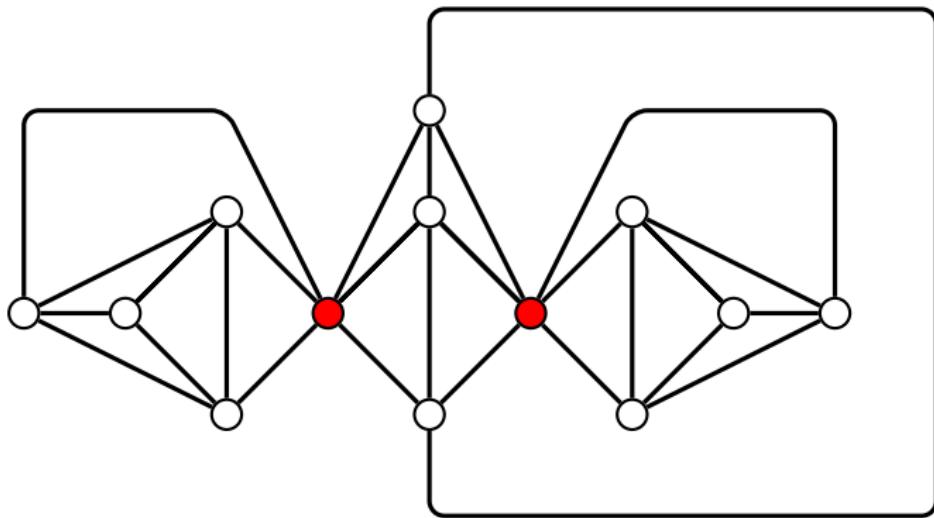
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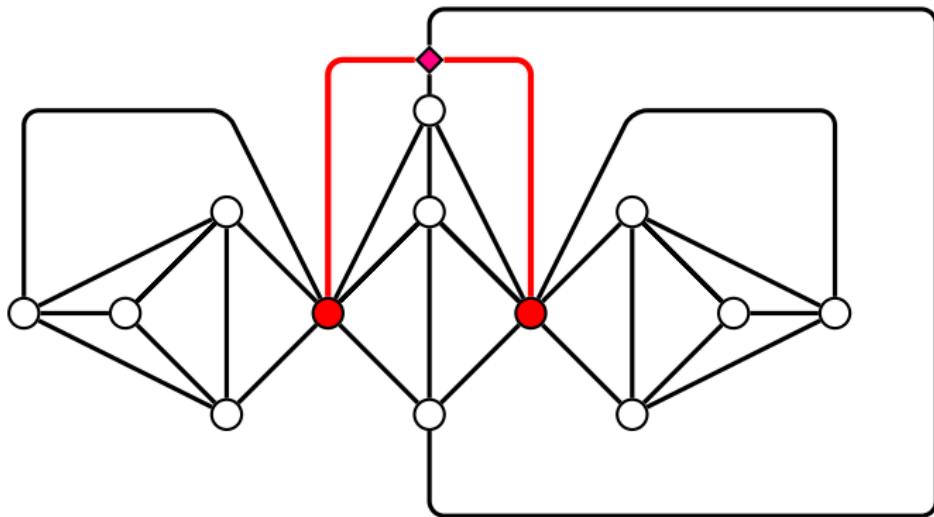


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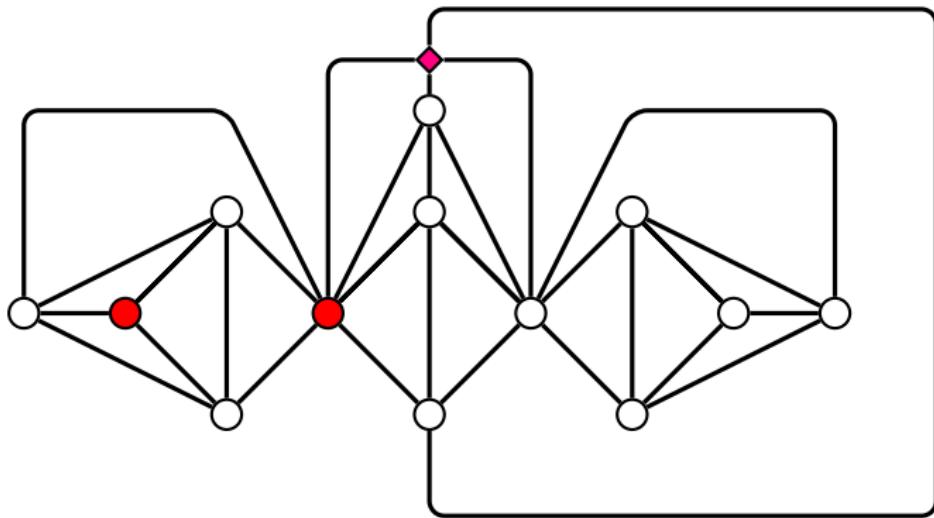


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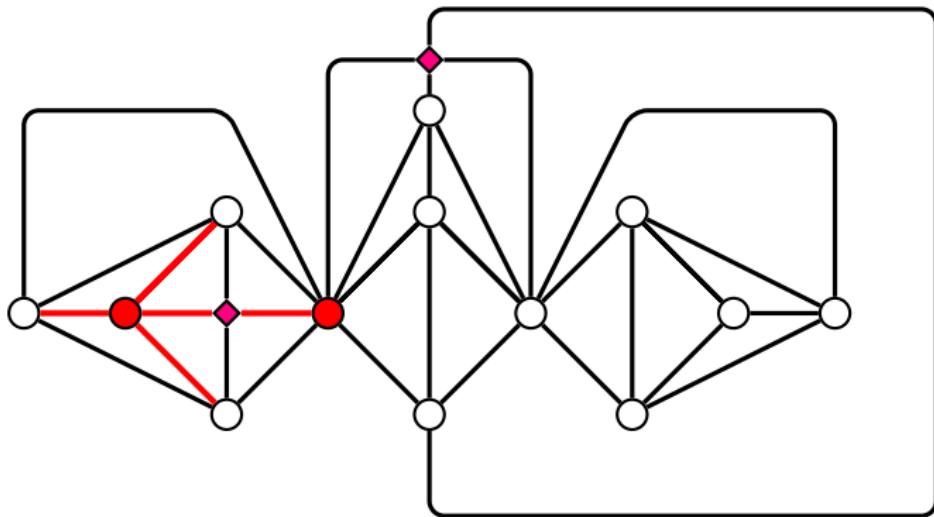


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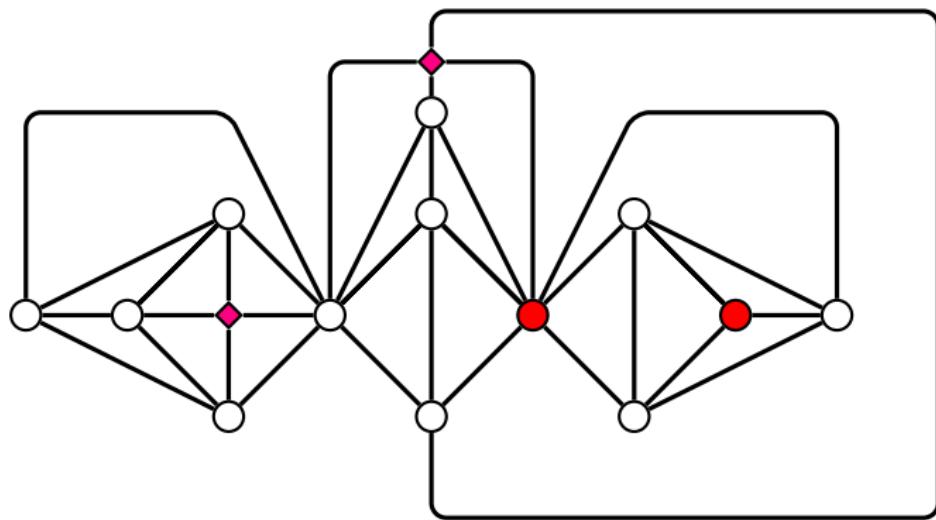


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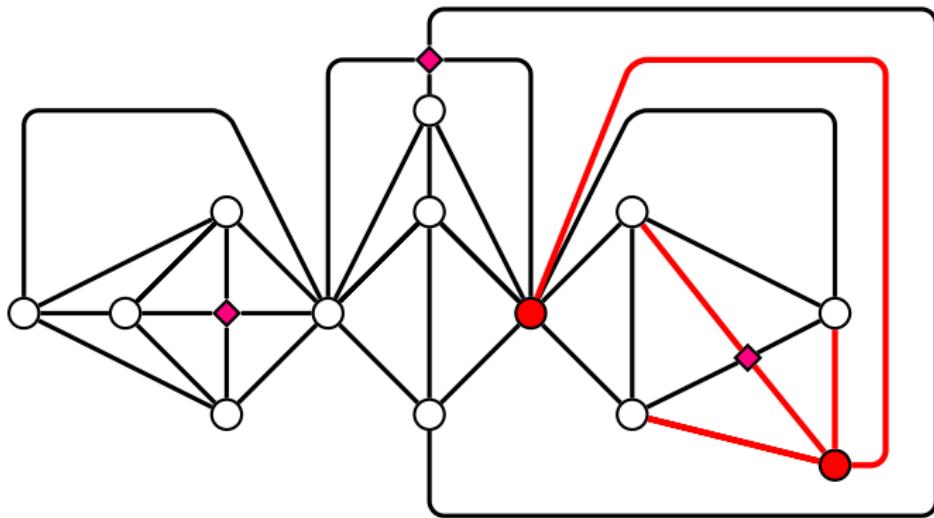


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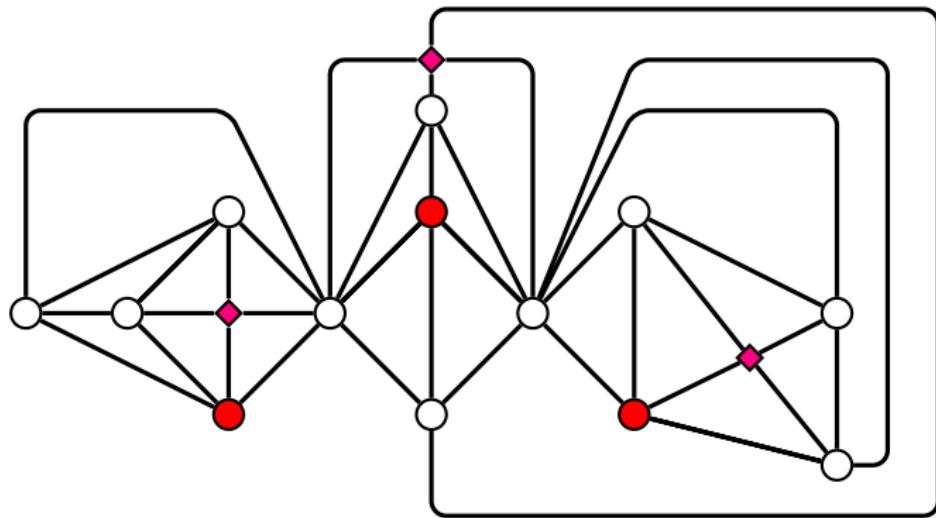


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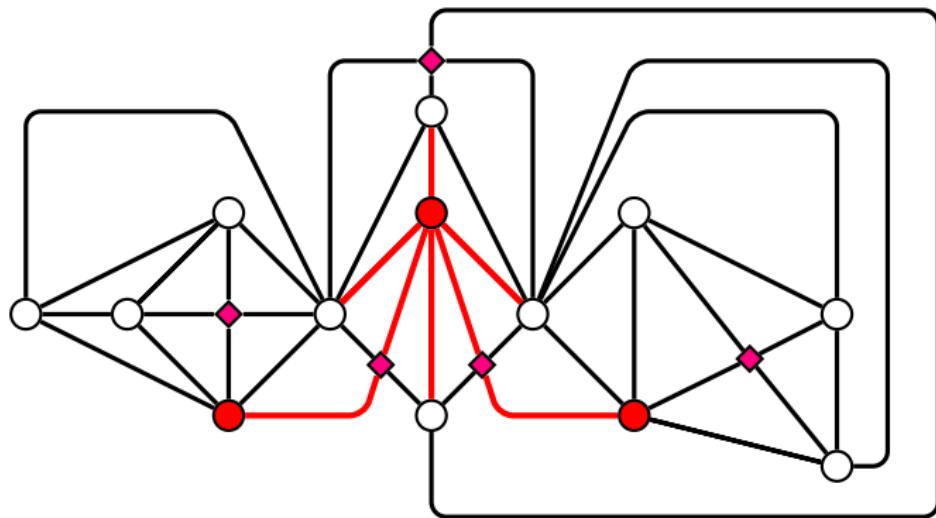


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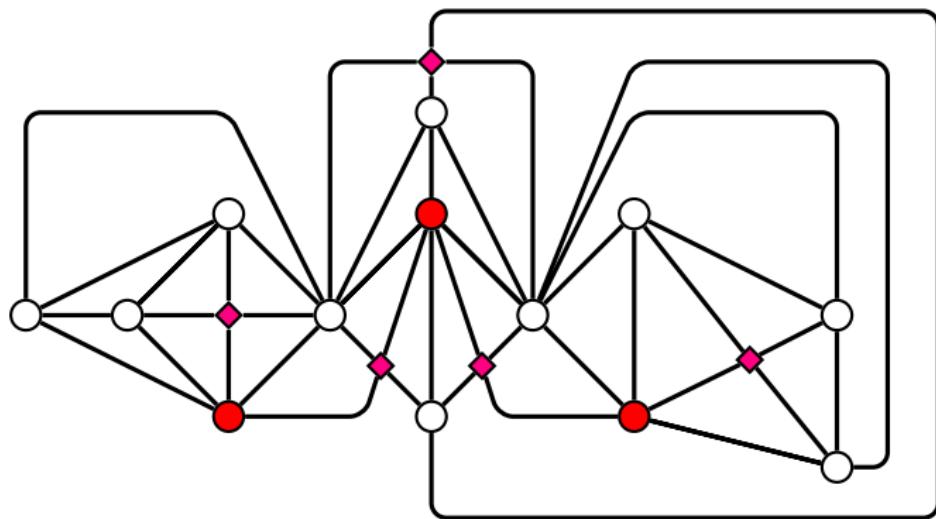


# Mixed Insertion Method

## Heuristic #3: Our Own Approach

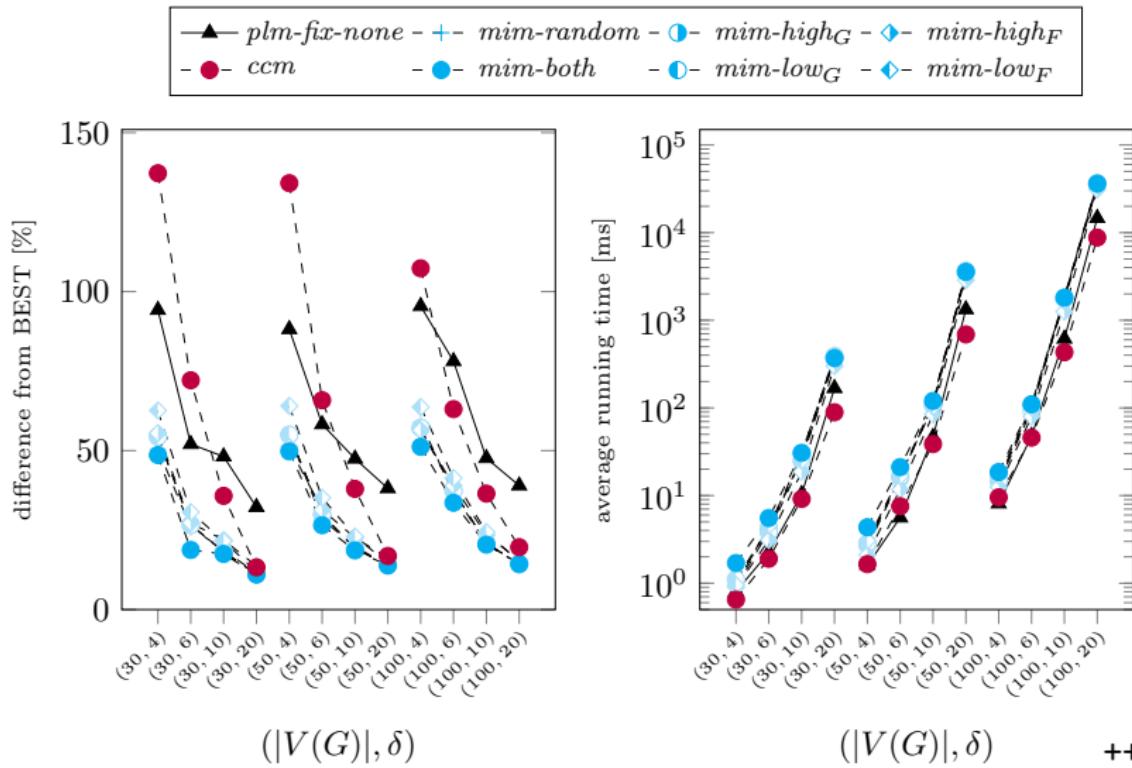
Motivation  
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→ compute planar subgraph, insert remaining edges  
via star insertion of their endpoints (if possible)



# Fast Heuristics Expanders

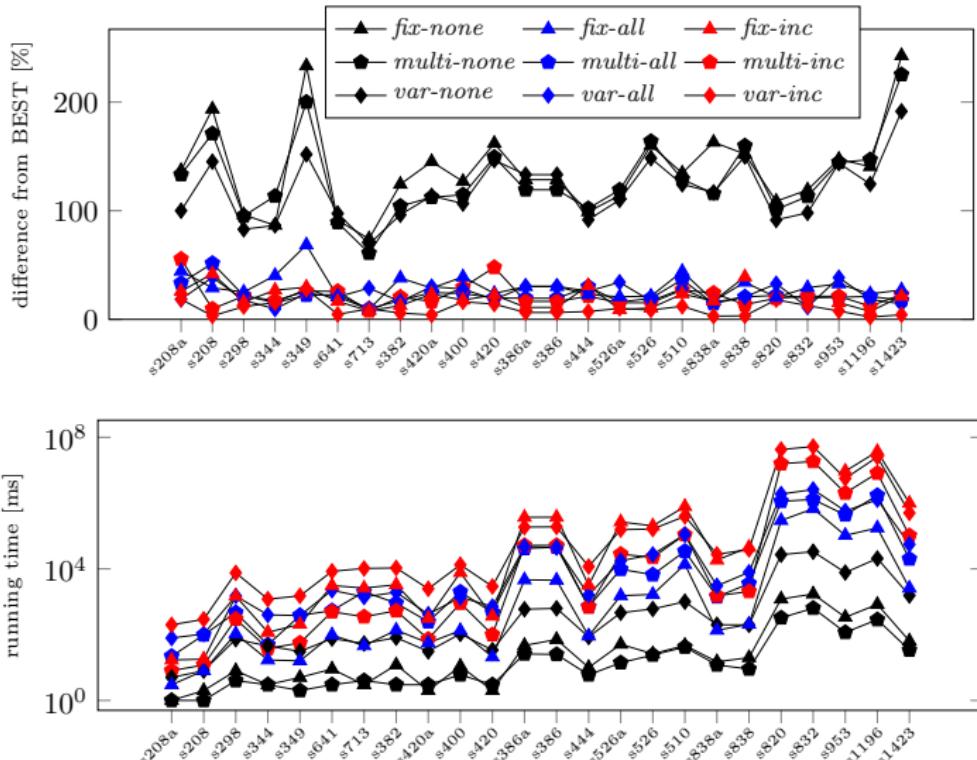
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# Planarization Method

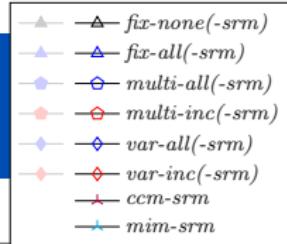
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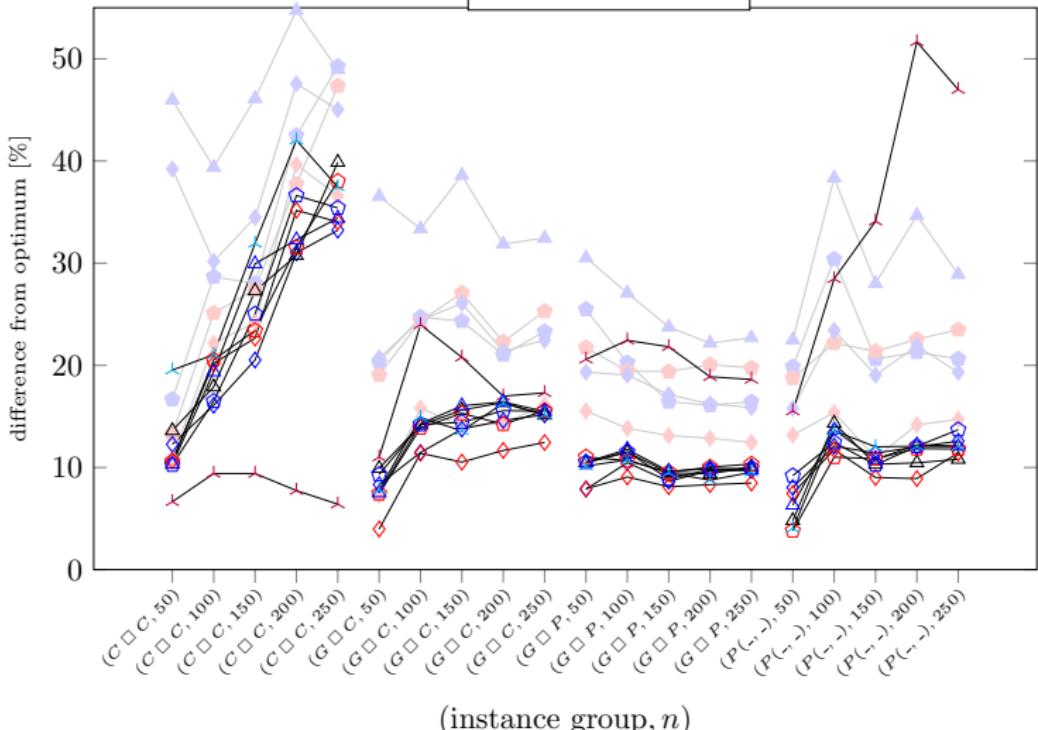


# Star Reinsertion Method

## KnownCR: Quality

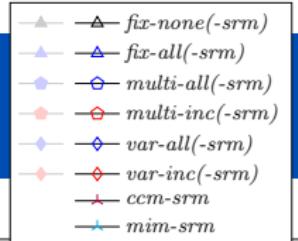


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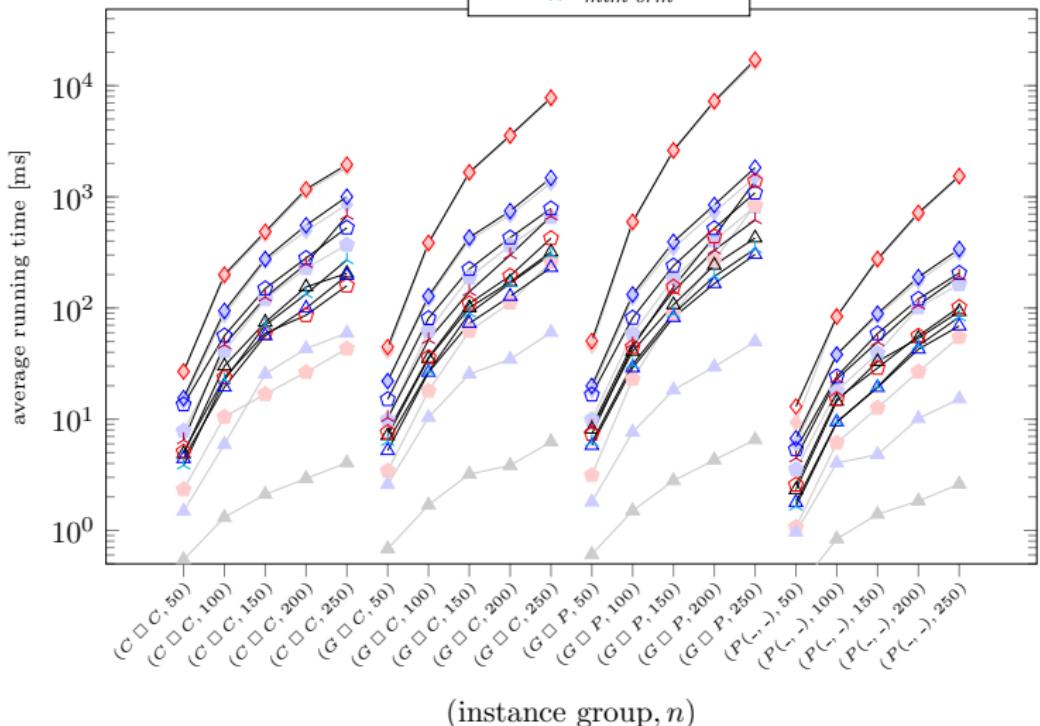


# Star Reinsertion Method

KnownCR: Time

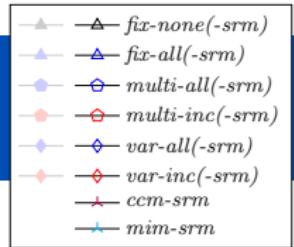


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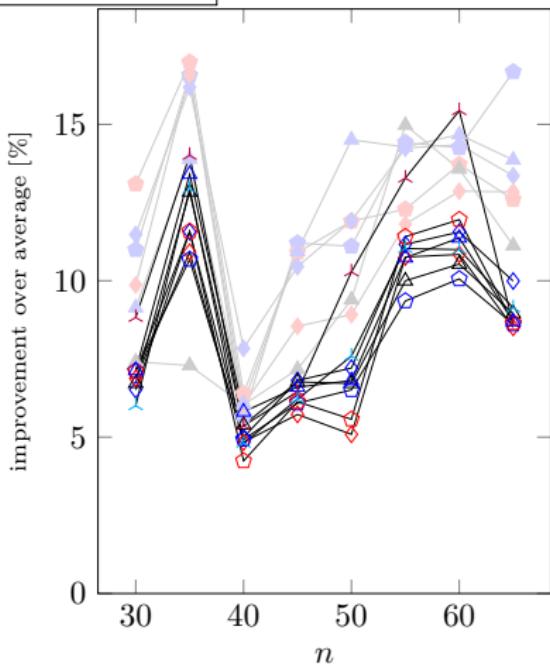
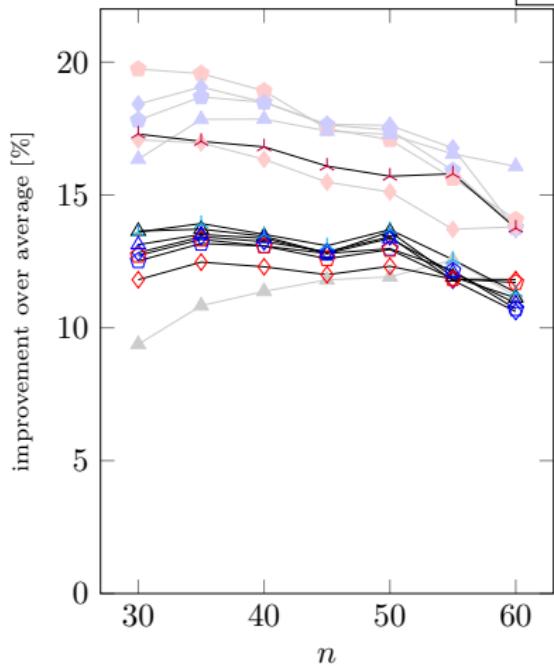


# Random Permutations

## Improvement: Rome and North



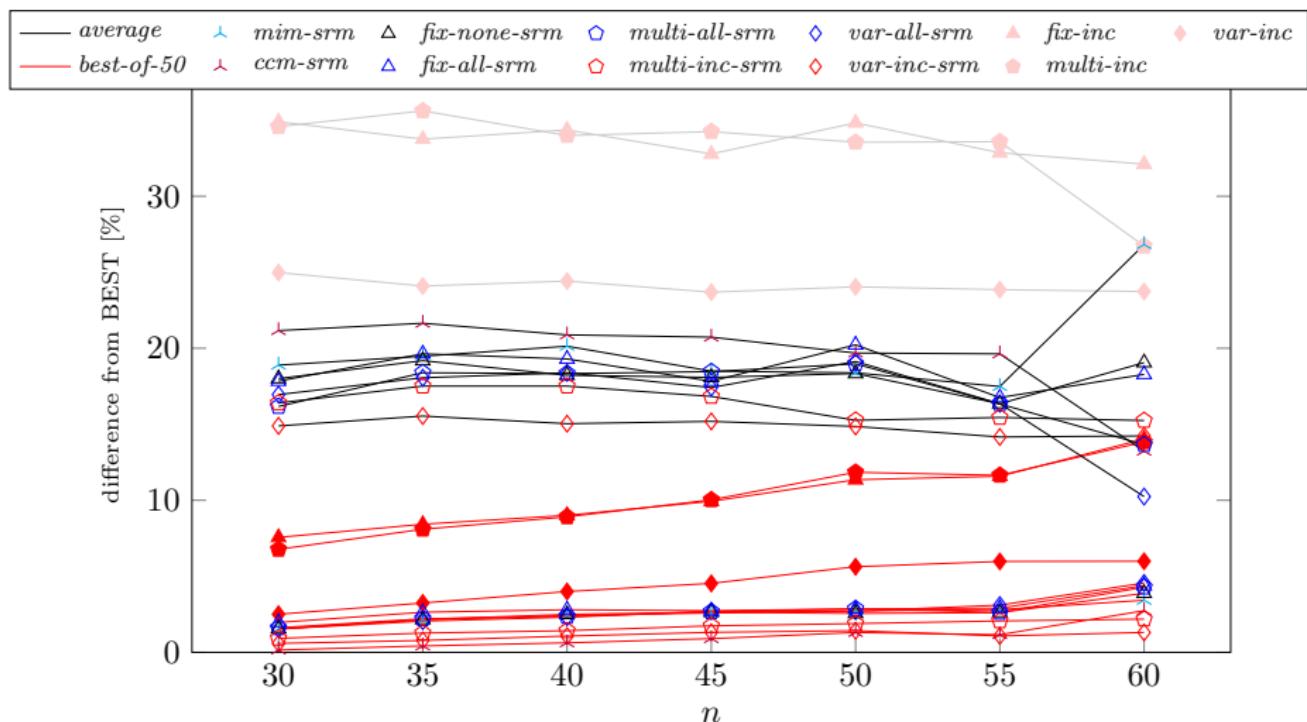
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# Random Permutations

Rome

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