

# Computing Parameters of Sequence-based Dynamic Graphs

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\*\*This is a joint work with Arnaud Casteigts, Yessin M. Neggaz, and Joseph G. Peters.

# Dynamic Networks

Highly dynamic networks?



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  - Faults and Failures?
  - Nature of the system
  - Change is normal



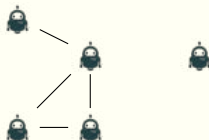
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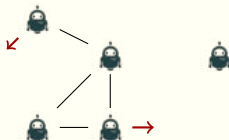
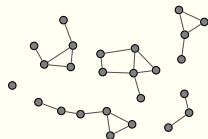
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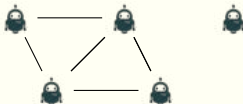
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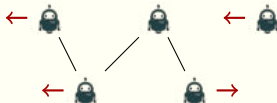
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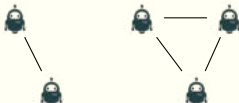
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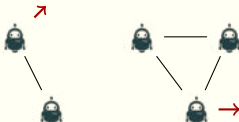
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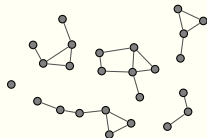
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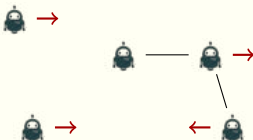
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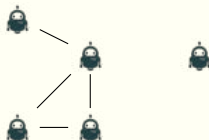
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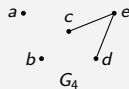
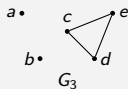
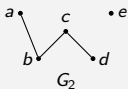
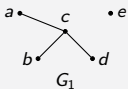
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# Dynamic Graphs

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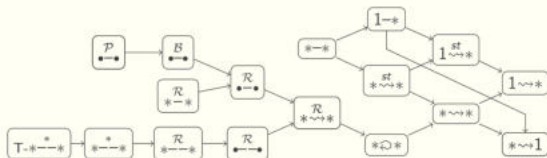
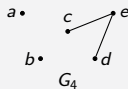
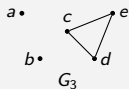
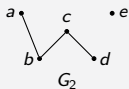
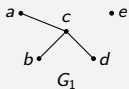


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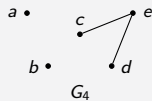
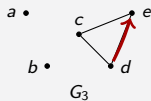
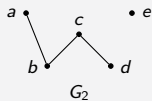
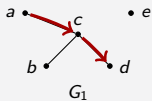


Dynamic graphs classes: [Casteigts, Flocchini, Quattrociochi et Santoro, 2011]

# Temporal Connectivity

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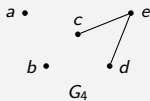
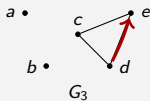
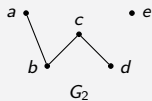
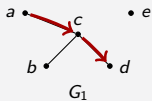
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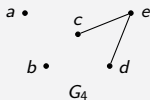
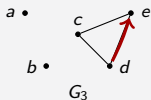
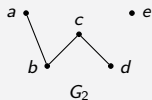
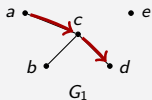
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 **Temporal connectivity**  $\iff \forall u, v \in V, u \rightsquigarrow v$ .

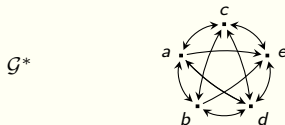
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Transitive closure of the journeys: reachability over time [Bhadra and Ferreira, 2003]



$\mathcal{G}$  is temporally connected  $\iff$  Transitive closure  $\mathcal{G}^*$  is complete

# High-level Strategy



$\mathcal{G}$



# High-level Strategy



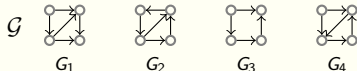
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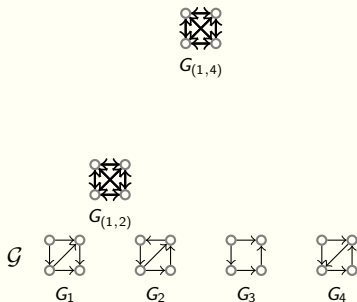


## TEMPORAL-DIAMETER

Finding the *temporal diameter* of a given dynamic graph  $\mathcal{G}$ , i.e. the smallest duration in which there exists a journey from any node to all other nodes.

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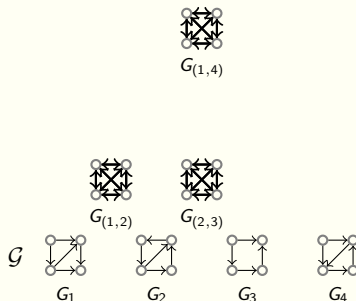


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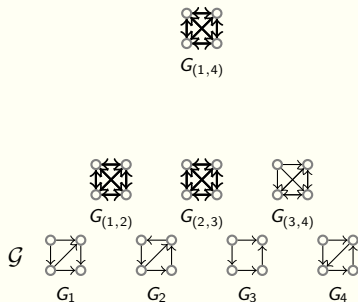
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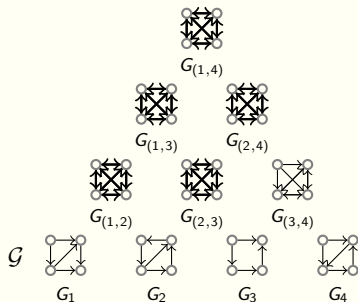
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- Completeness test

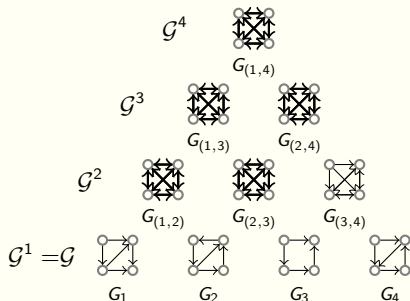


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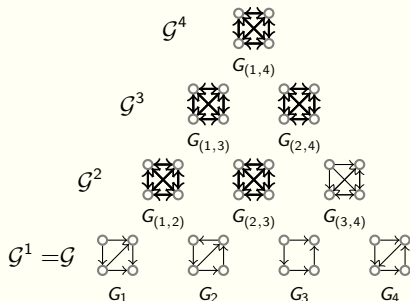


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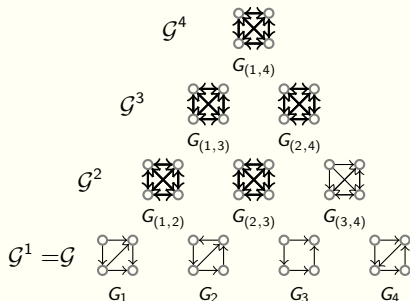
Finding the *temporal diameter* of a given dynamic graph  $\mathcal{G}$ , i.e. the smallest duration in which there exists a journey from any node to all other nodes.



Finding the smallest  $d$  such that every super node in row  $G^d$  is a complete graph (i.e. every subsequence of length  $d$  is temporally connected).

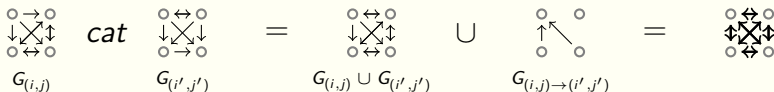
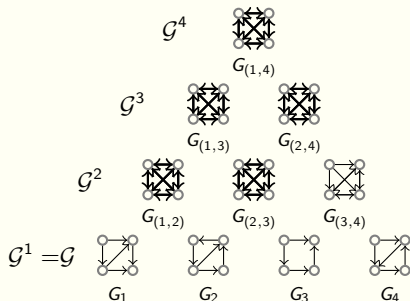
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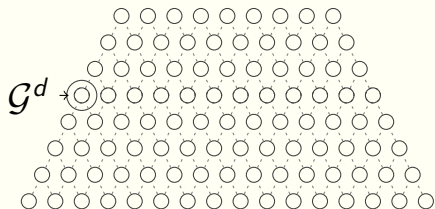
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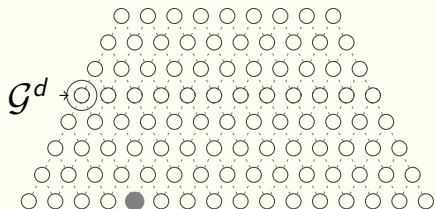
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Decision version (given  $d$ )



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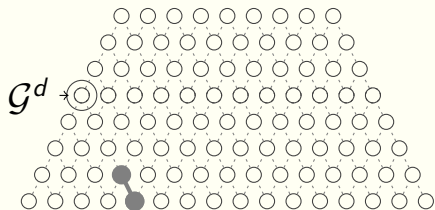
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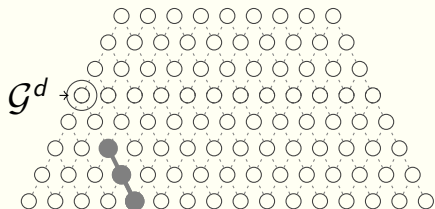
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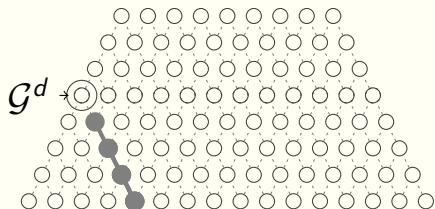
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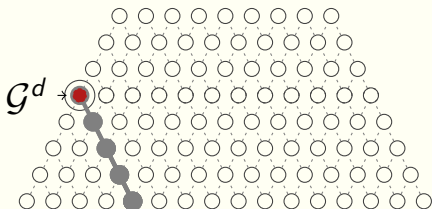
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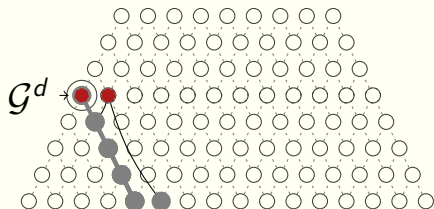
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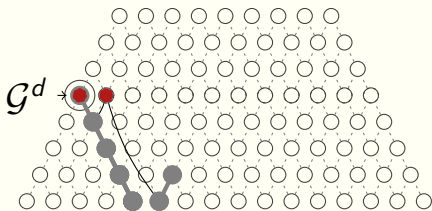
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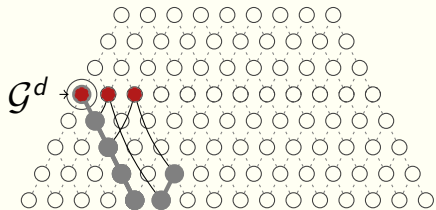
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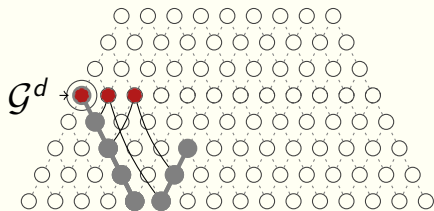
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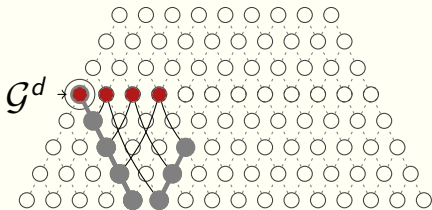




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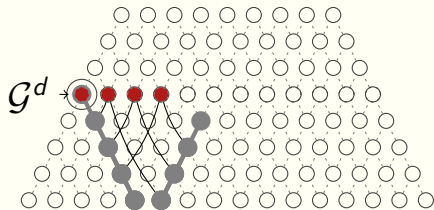
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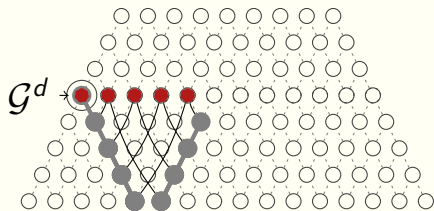
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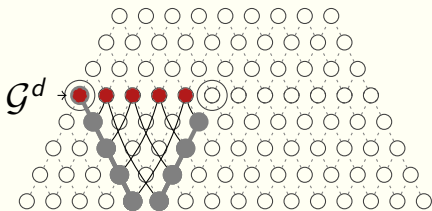
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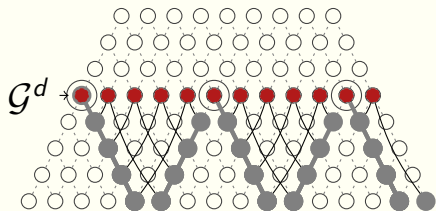
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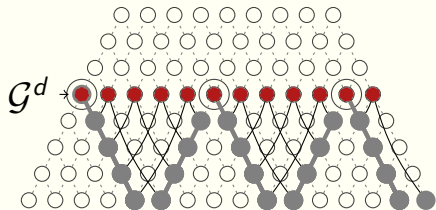
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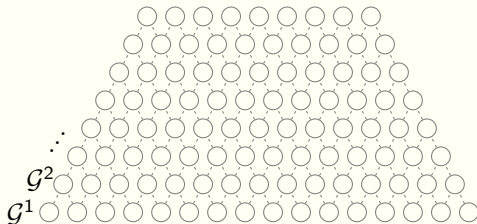
$O(\delta)$  elementary operations per row

# Temporal Diameter Computation

Minimization version (find the temporal diameter  $d$ )

# Transitive Closures Computation

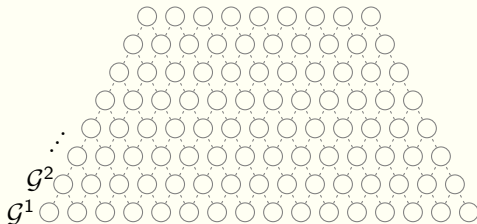
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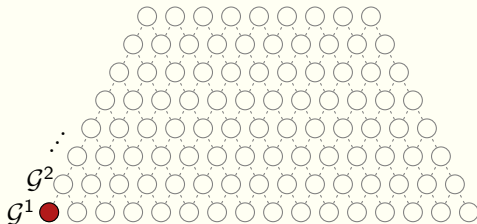
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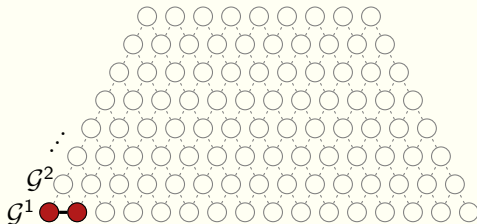
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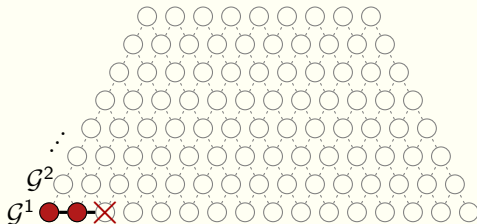
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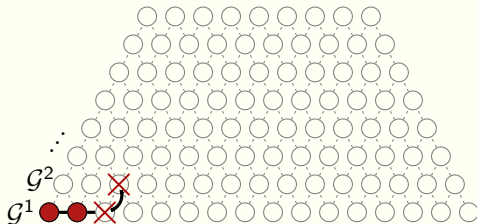
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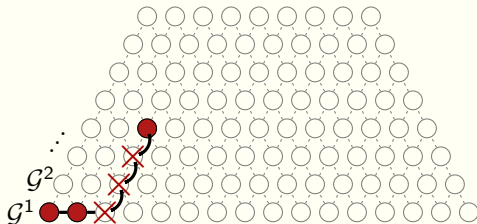
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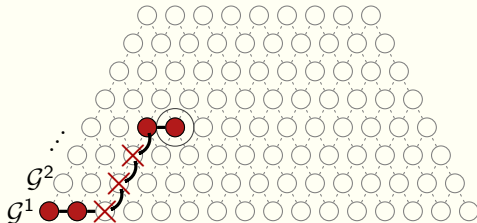
- Strategy: ascending walk



# Transitive Closures Computation

Minimization version (find the temporal diameter  $d$ )

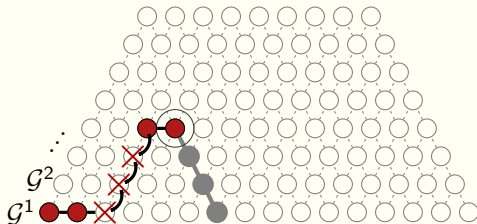
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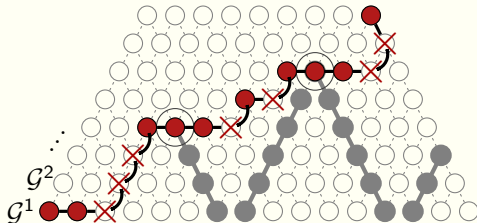




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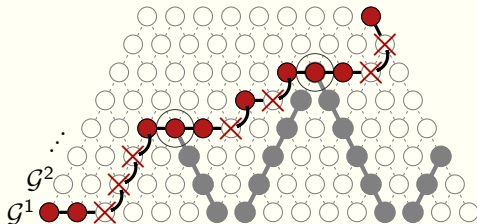
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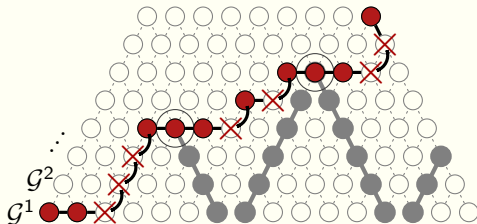
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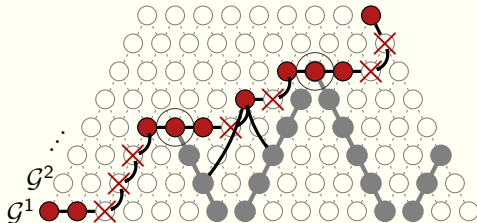


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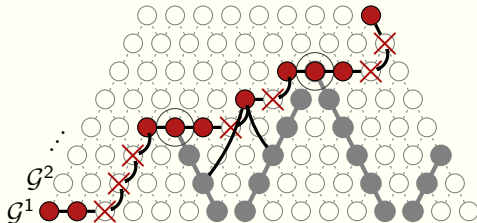


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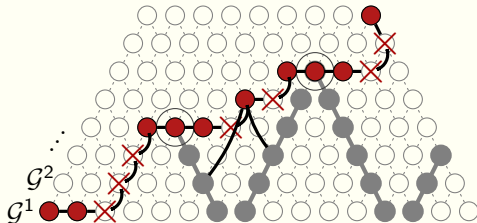


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Temporal-Diameter is solvable with  $O(\delta)$  elementary operations

# Online Algorithms

# Online Algorithms

- ❖ The optimal algorithms can be adapted to an **online setting**
- ❖ The sequence of graphs  $G_1, G_2, G_3, \dots$  of  $\mathcal{G}$  is processed in the order of reception
- ❖ **Amortized cost of  $O(1)$**  elementary operations per graph received
- ❖ Dynamic version: consider only the recent history



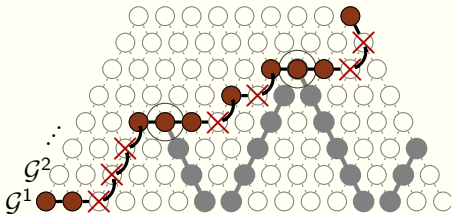
# Generic Framework

# A Generic Framework

- ▣ Solve other problems using the same framework

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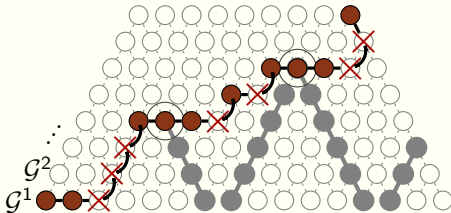


## Framework generalization

- ▣ Transitive closures concatenation
- ▣ Completeness test
- ▣ Transitive closure

# A Generic Framework

- ❏ Solve other problems using the same framework

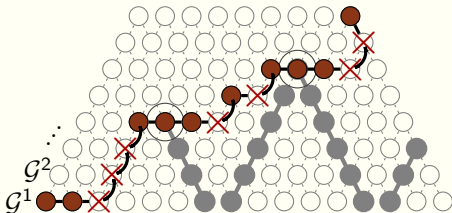


## Framework generalization

❏ Transitive closures concatenation	→	<b>Composition operation</b>
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## Minimization problems

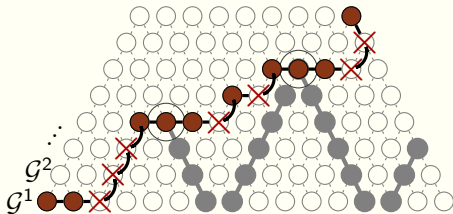
Find the **smallest** value

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## Minimization problems

Find the **smallest** value

V.S

## Maximization problems

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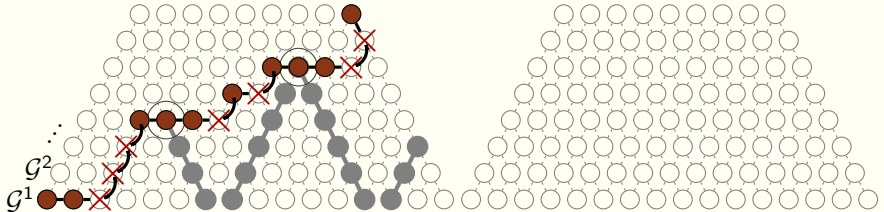
### Framework generalization

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**Composition operation**  
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## Maximization problems

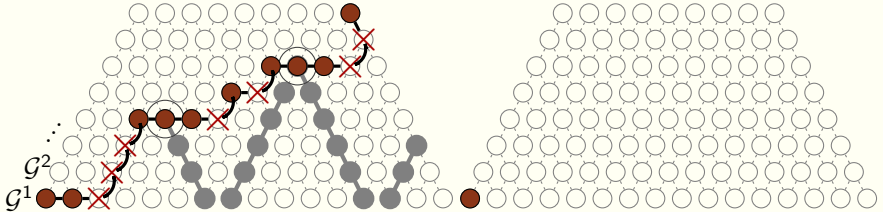
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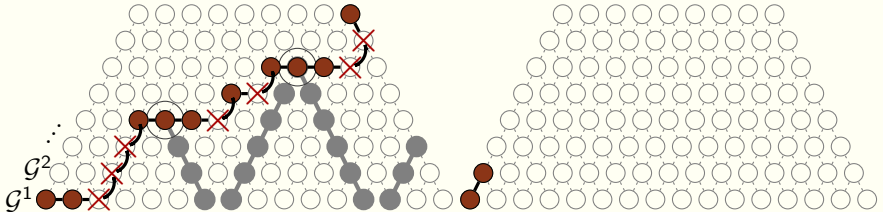
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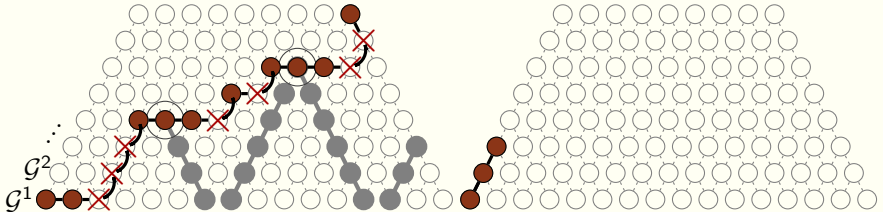
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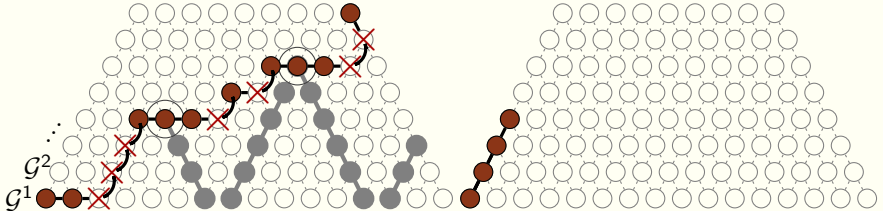
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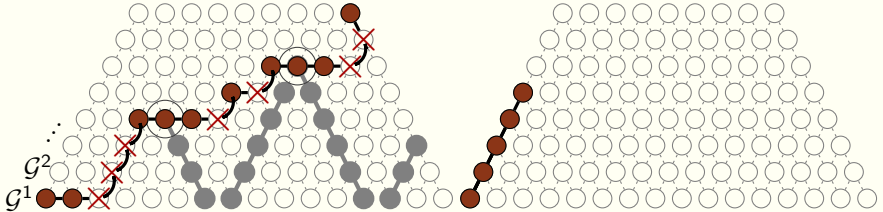
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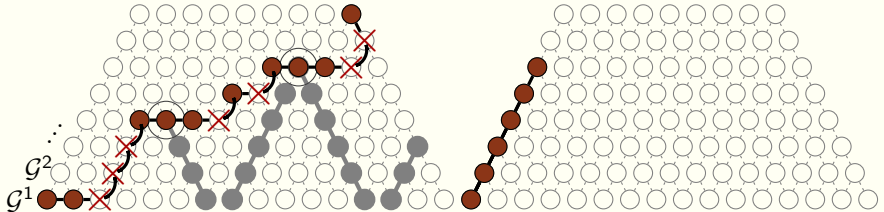
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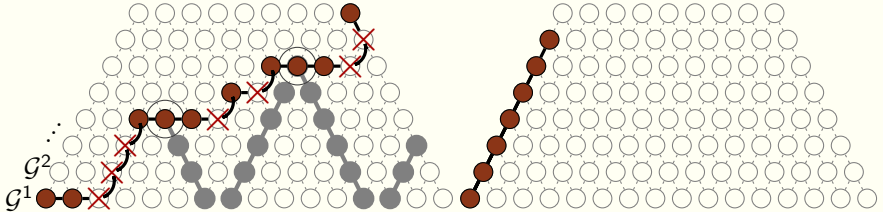
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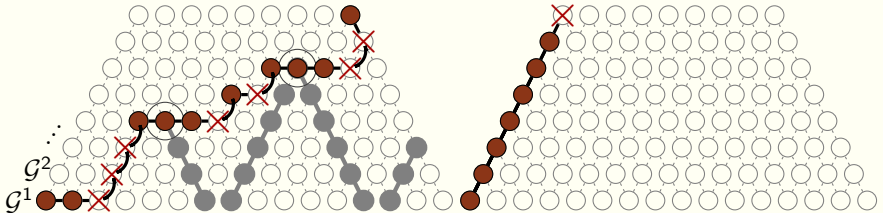
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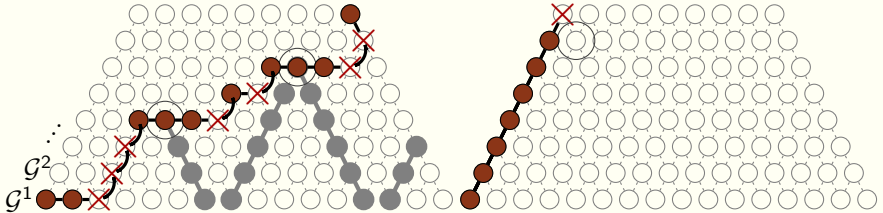
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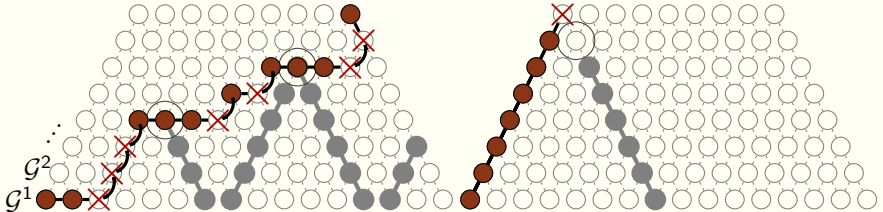
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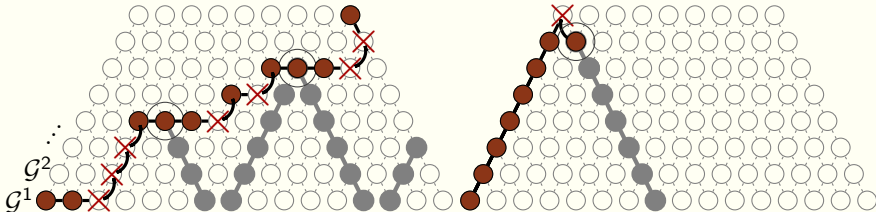
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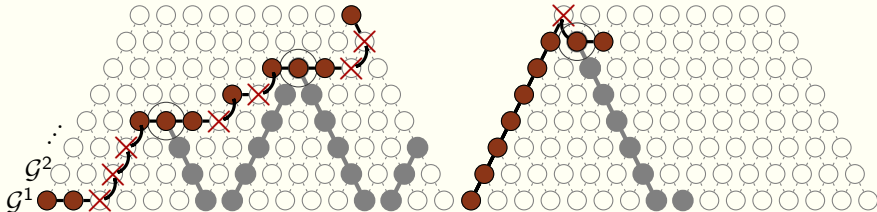
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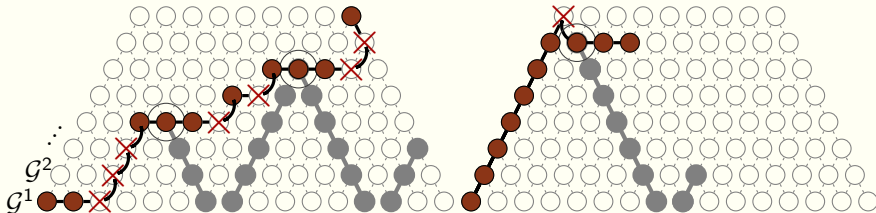
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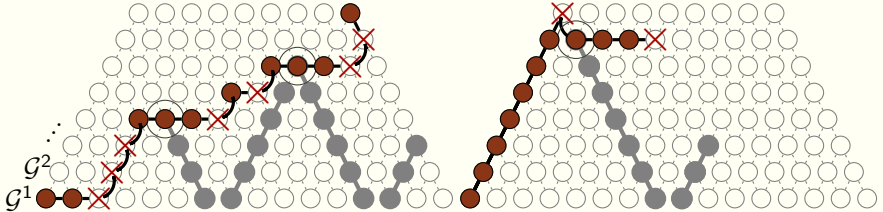
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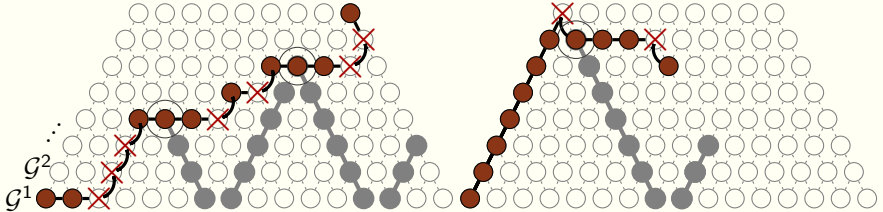
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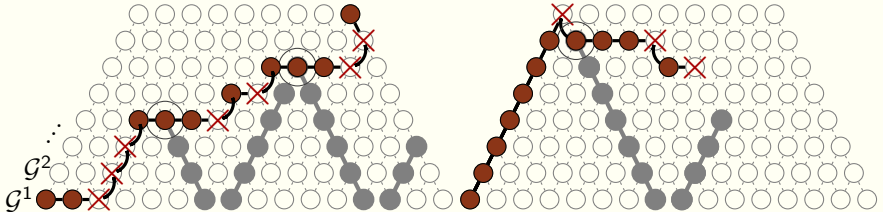
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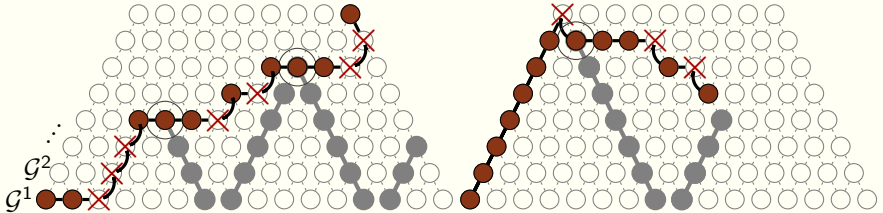
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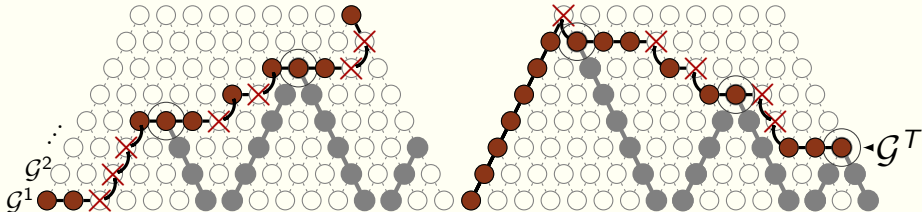
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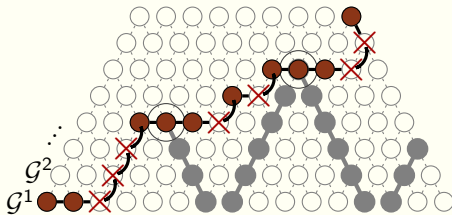
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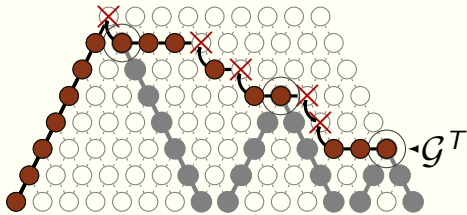
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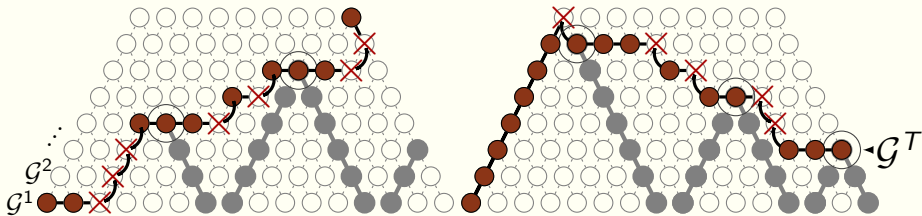


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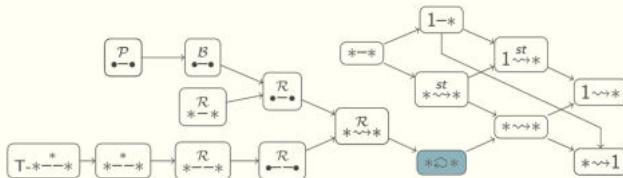
### Requirements

- ▣  $test(G_{(i,j)}) = true \Leftrightarrow \{G_i, G_{i+1}, \dots, G_j\}$  satisfies the property  $P$
- ▣ The composition operation is associative
- ▣ Only minimization: If  $test(G_{(i,j)}) = true$  then  $test(G_{(i',j')}) = true, \forall i' \leq i, j' \geq j$
- ▣ Only maximization: If  $test(G_{(i,j)}) = true$  then  $test(G_{(i',j')}) = true, \forall i' \geq i, j' \leq j$

# Round-trip Temporal Connectivity

## Round-trip Temporal Connectivity

A dynamic graph  $\mathcal{G}$  is round-trip temporal connected if and only if a back-and-forth journey exists from any node to all other nodes.



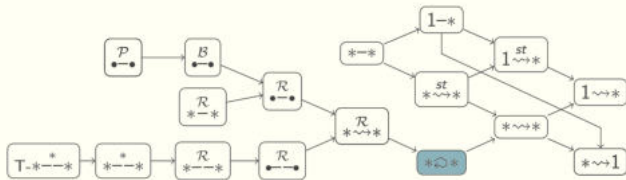
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Finding the smallest duration in which there exists a back-and-forth journey from any node to all other nodes.



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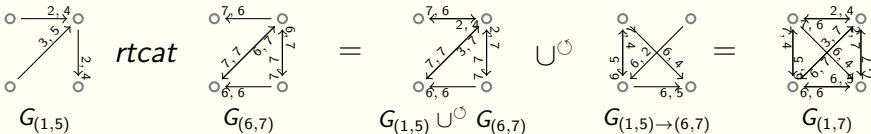
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## ROUND-TRIP-TEMPORAL-DIAMETER(minimization)

Finding the smallest duration in which there exists a back-and-forth journey from any node to all other nodes.

 **Super node:** Round-trip transitive closure

 **Composition operation:** Round-trip transitive closure concatenation

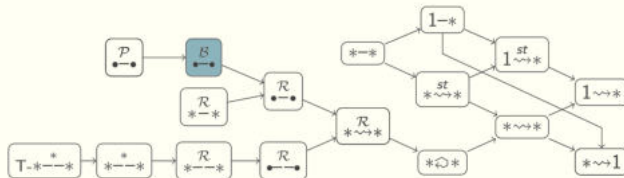


 **Test operation:** Round-trip completeness

# Bounded Realization of the footprint

## Time-bounded edge reappearance

A dynamic graph  $\mathcal{G}$  has a time-bounded edge reappearance with a bound  $b$  if the time between two appearances of the same edge is at most  $b$ .



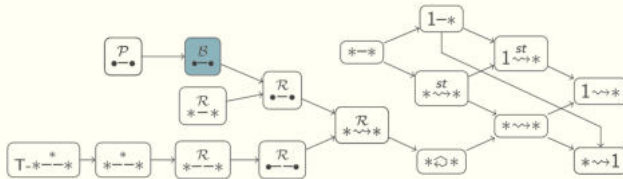
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Finding the smallest  $b$  such that in every subsequence of length  $b$  in the sequence  $\mathcal{G}$ , all the edges of the footprint appear at least once.





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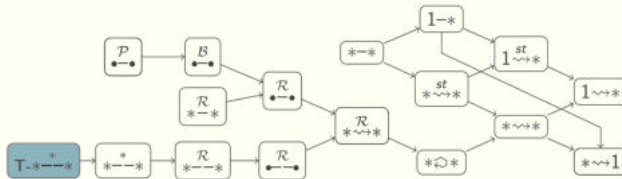
Finding the smallest  $b$  such that in every subsequence of length  $b$  in the sequence  $\mathcal{G}$ , all the edges of the footprint appear at least once.

- ❑ **Super node:** Union graphs
- ❑ **Composition operation:** Union
- ❑ **Test operation:** Equality to the footprint

# T-interval Connectivity

Definition:  $T$ -interval connectivity

A dynamic graph  $\mathcal{G}$  is  $T$ -interval connected if and only if every  $T$  length sequence of graphs has a common connected spanning sub-graph.



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T-INTERVAL-CONNECTIVITY (maximization)

Finding the largest  $T$  for which the graph is  $T$ -interval connected.



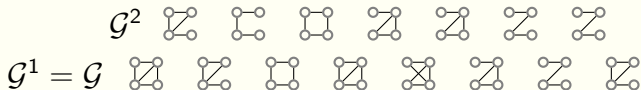
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$T$ -INTERVAL-CONNECTIVITY (maximization)

Finding the largest  $T$  for which the graph is  $T$ -interval connected.



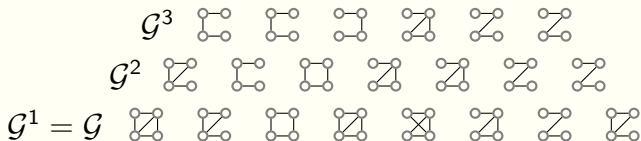
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- **Test operation:** Connectivity test

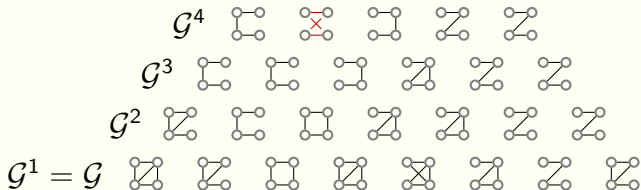
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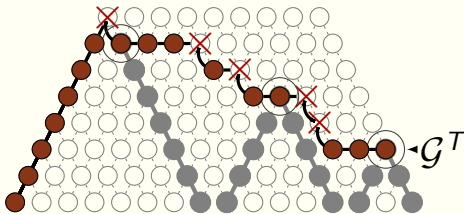
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# Symmetric Problems

## Symmetric Problems

A minimization or maximization problem is symmetric if:

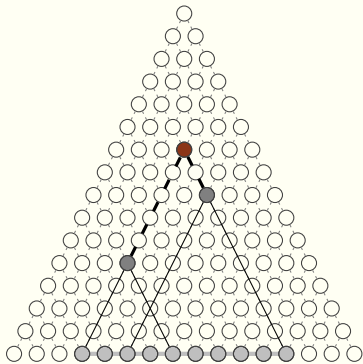
for all  $i, j, i', j' \leq \delta$ ,  $i \leq i' \leq j$ ,  $\text{composition}(G_{(i,j)}, G_{(i',j')}) = G_{(i,j')}$ .

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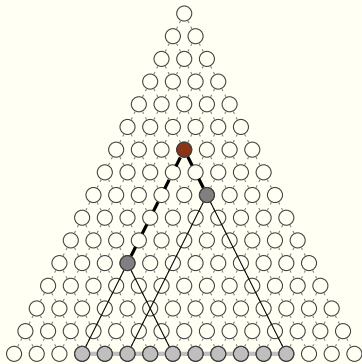


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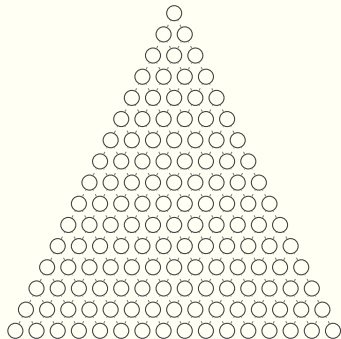


e.g T-INTERVAL-CONNECTIVITY and BOUNDED-REALIZATION-OF-THE-FOOTPRINT

# Row-Based Strategy

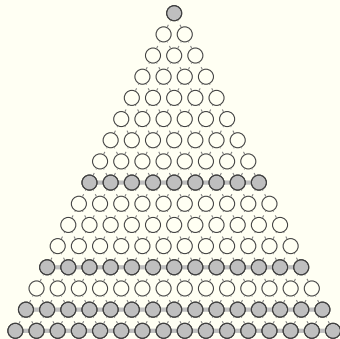
# Row-Based Strategy

Symmetric problems (maximization)



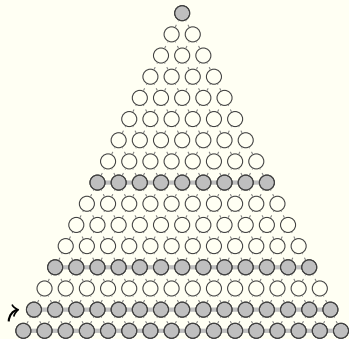
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Symmetric problems (maximization)



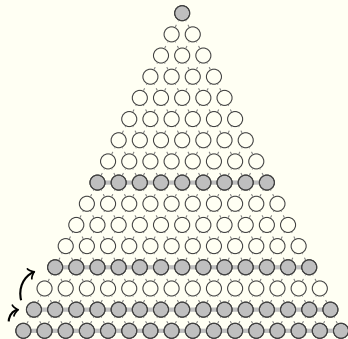
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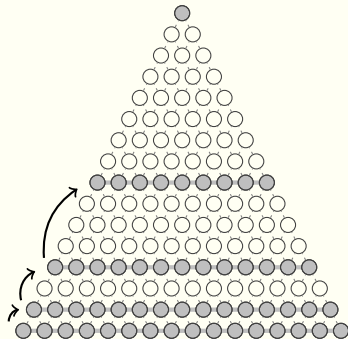




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Symmetric problems (maximization)

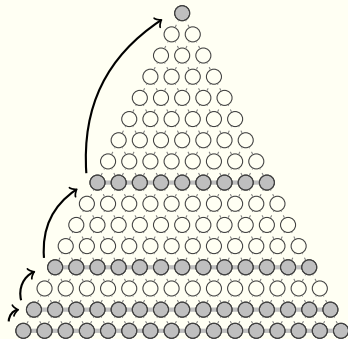
- ❖  $O(\delta)$  composition per row
- ❖  $O(\delta)$  tests per row



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Symmetric problems (maximization)

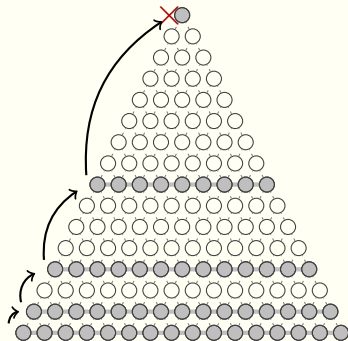
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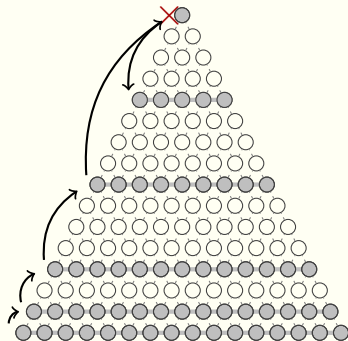
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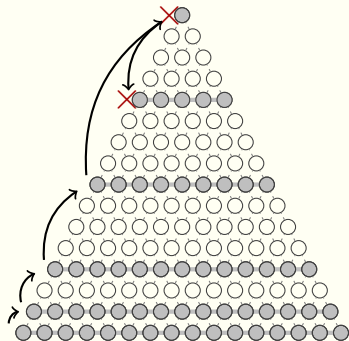
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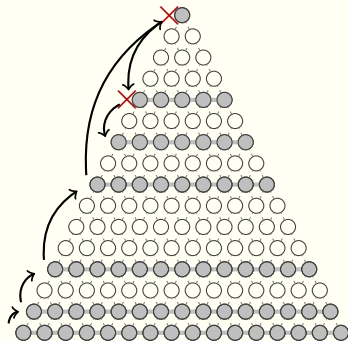
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Symmetric problems (maximization)

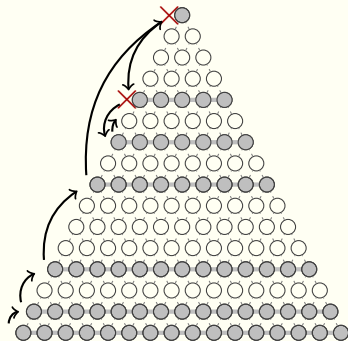
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Symmetric problems (maximization)

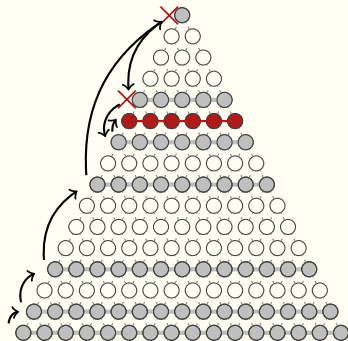
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Symmetric problems (maximization)

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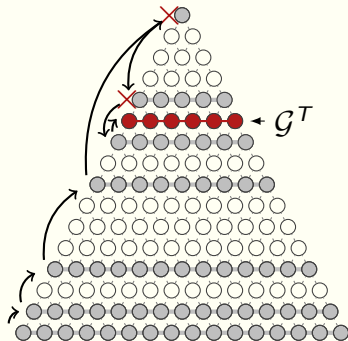




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Symmetric problems (maximization)

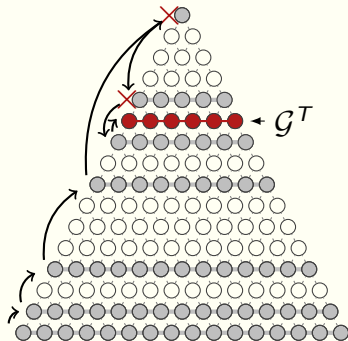
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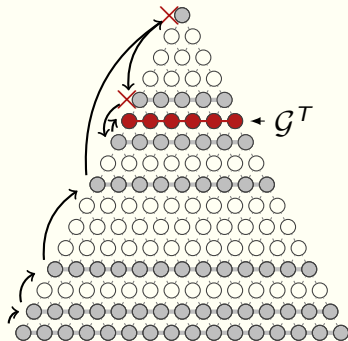
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- ❖  $O(\log \delta)$  rows



# Row-Based Strategy

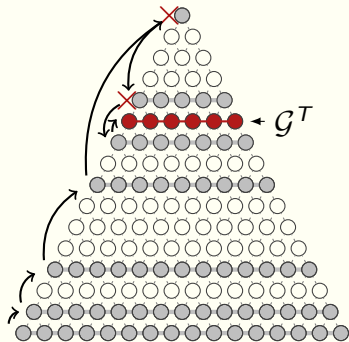
Symmetric problems (maximization)  
 $O(\delta \log \delta)$  **elementary operations**

- ❖  $O(\delta)$  composition per row
- ❖  $O(\delta)$  tests per row
- ❖  $O(\log \delta)$  rows



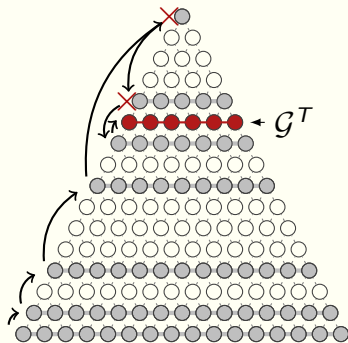
# Parallel Version

On EREW PRAM



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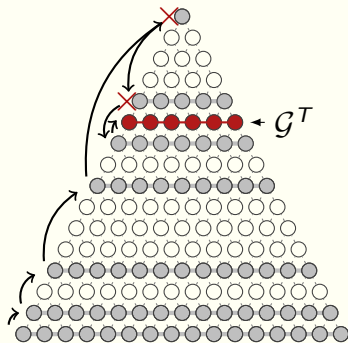
On EREW PRAM



# Parallel Version

## On EREW PRAM

- Symmetric problems are solvable in  $O(\log^2 \delta)$  on an **EREW PRAM** with  $O(\delta)$  processors



# Conclusion

## ❖ Conclusion

- ❖ High-level strategies for computing minimization and maximization parameters
- ❖ Algorithms that use only  $O(\delta)$  elementary operations
- ❖ Parallel versions on PRAM (in Nick's class)
- ❖ Online algorithms with amortized cost of  $O(1)$  elementary operations per graph received

## ❖ Perspectives

- ❖ How about other classes?
- ❖ Generic Framework
  - ▶ What if the evolution of the dynamic graph is constrained?

**Thank you !**