

# Lower Bounds for Local Algorithms

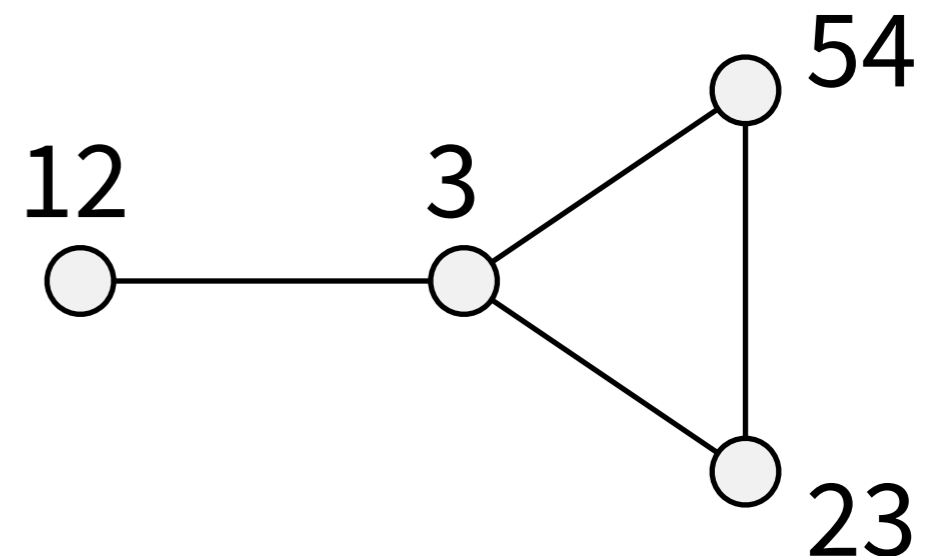
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ADGA · Austin, Texas · 12 October 2014

# LOCAL model

- **Input:** simple undirected **graph  $G$** 
  - communication network
  - nodes labelled with unique  $O(\log n)$ -bit identifiers



# LOCAL model

- **Input:** simple undirected graph  $G$
- **Output:** each node  $v$  produces a **local output**
  - graph colouring: colour of node  $v$
  - vertex cover: 1 if  $v$  is in the cover
  - matching: with whom  $v$  is matched

# LOCAL model

- **Nodes exchange messages with each other, update local states**
- **Synchronous communication rounds**
- **Arbitrarily large messages**

# LOCAL model

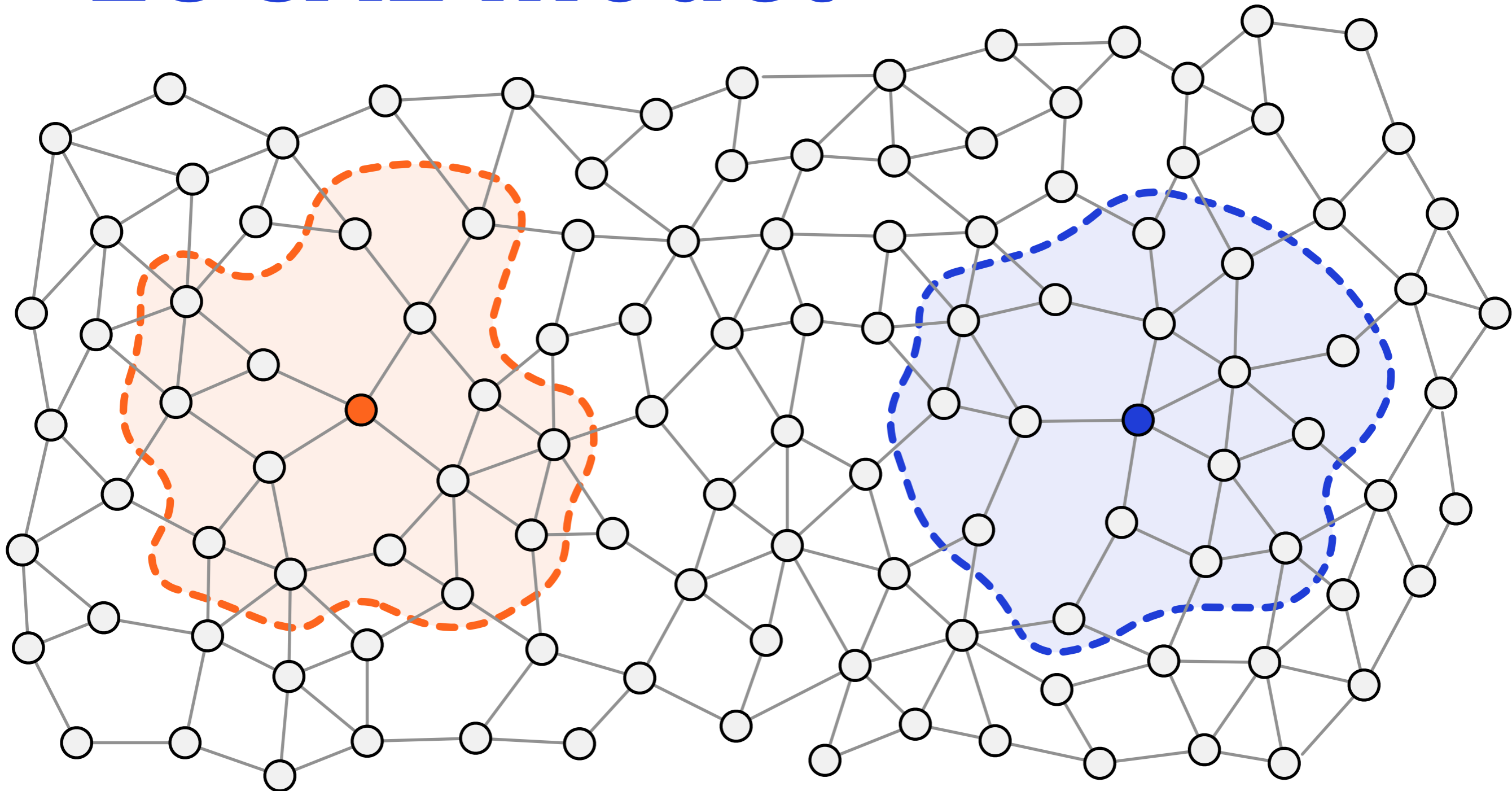
- **Time = number of communication rounds**
  - until all nodes stop and produce their **local outputs**

# LOCAL model

- **Time = number of communication rounds**
- **Time = distance:**
  - in  $t$  communication rounds, all nodes can learn everything in their **radius- $t$  neighbourhoods**

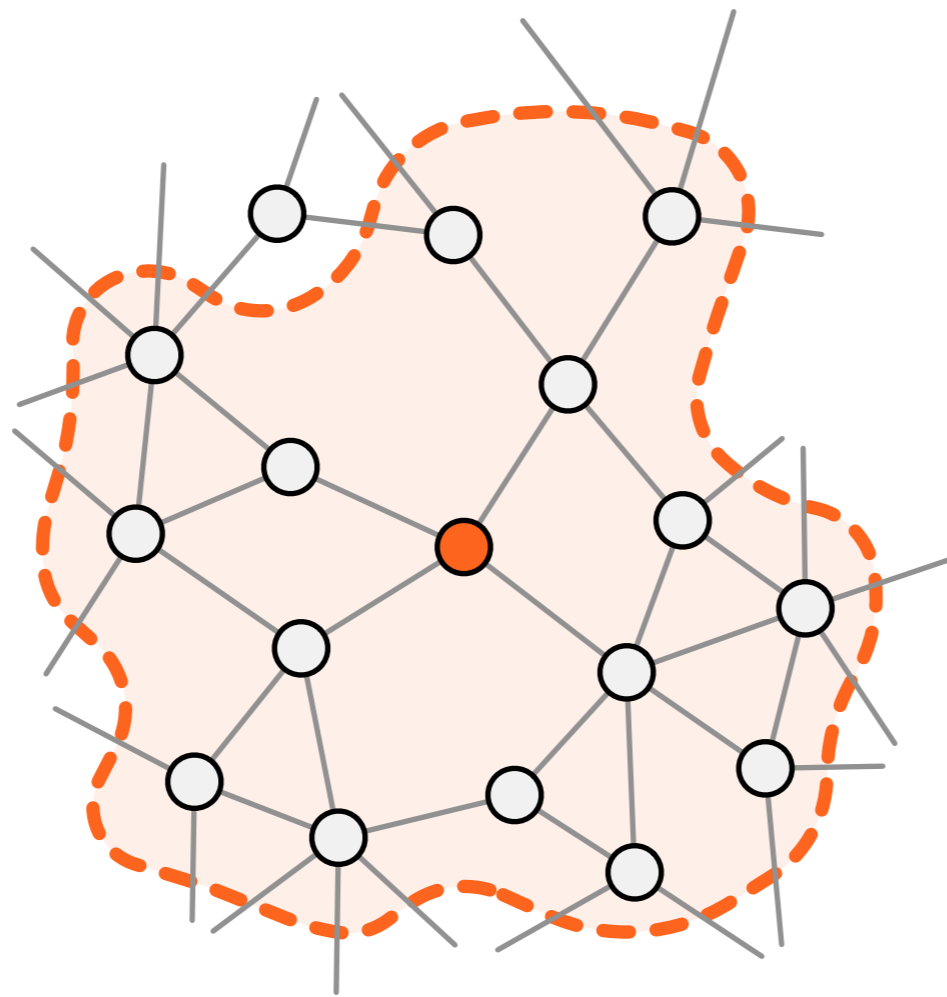
time  $t = 2$

# LOCAL model



# LOCAL model

A:



→ 1



# LOCAL model

- **Everything trivial in time  $\text{diam}(G)$** 
  - all nodes see whole  $G$ ,  
can compute any function of  $G$
- **What can be solved much faster?**











# Distributed time complexity

- **Smallest  $t$  such that the problem can be solved in time  $t$**

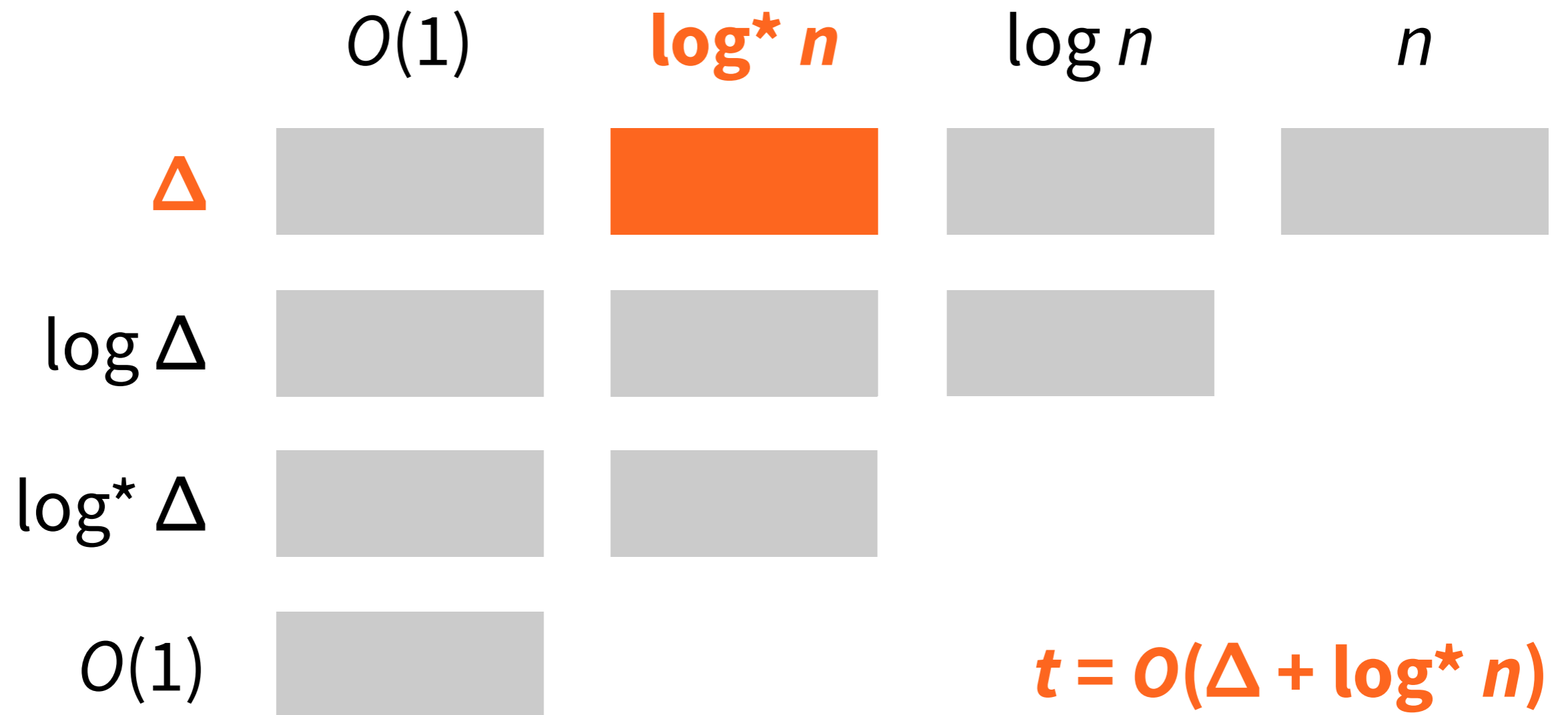
# Distributed time complexity

- $n$  = number of nodes
- $\Delta$  = maximum degree
  - $\Delta < n$
- Time complexity  $t = t(n, \Delta)$

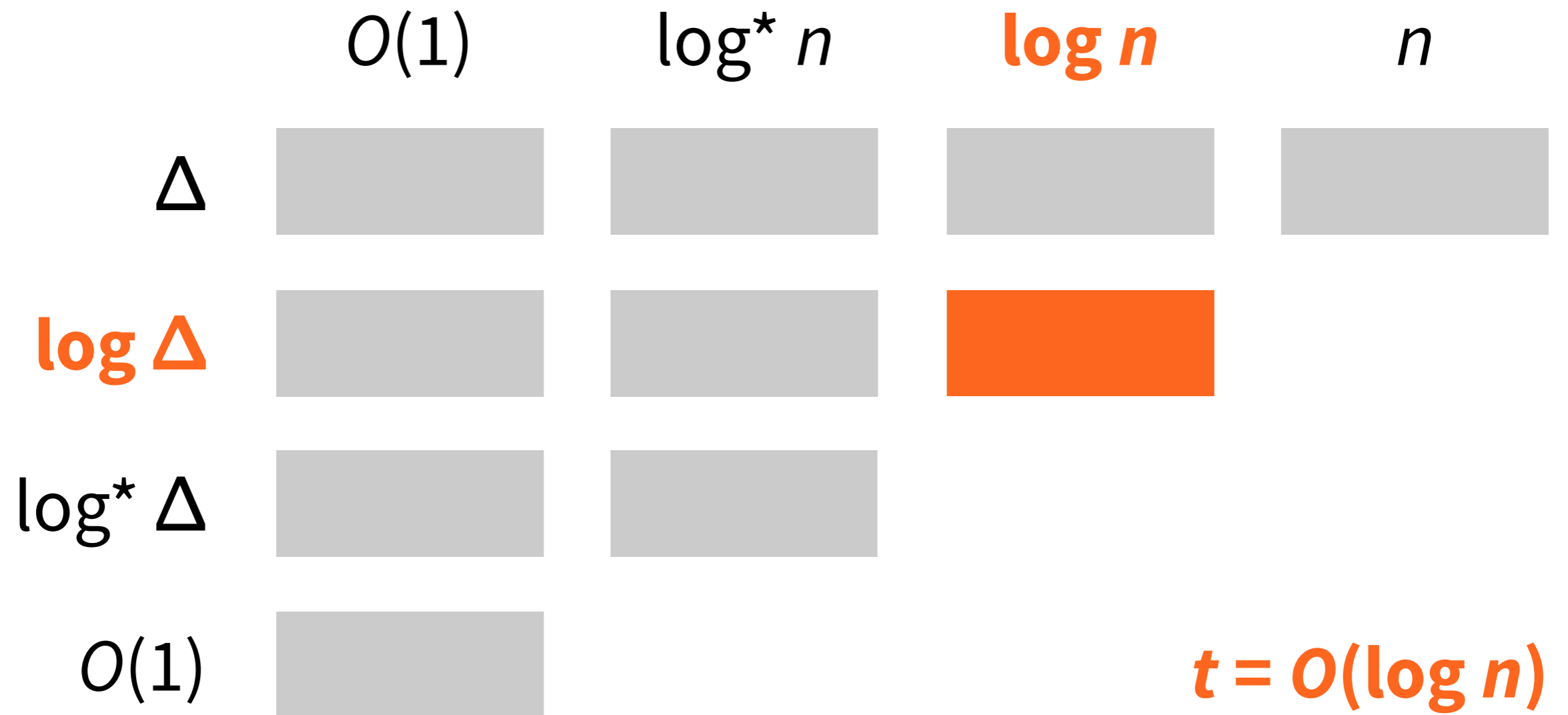
# Landscape

	$O(1)$	$\log^* n$	$\log n$	$n$
$\Delta$				
$\log \Delta$				
$\log^* \Delta$				
$O(1)$				

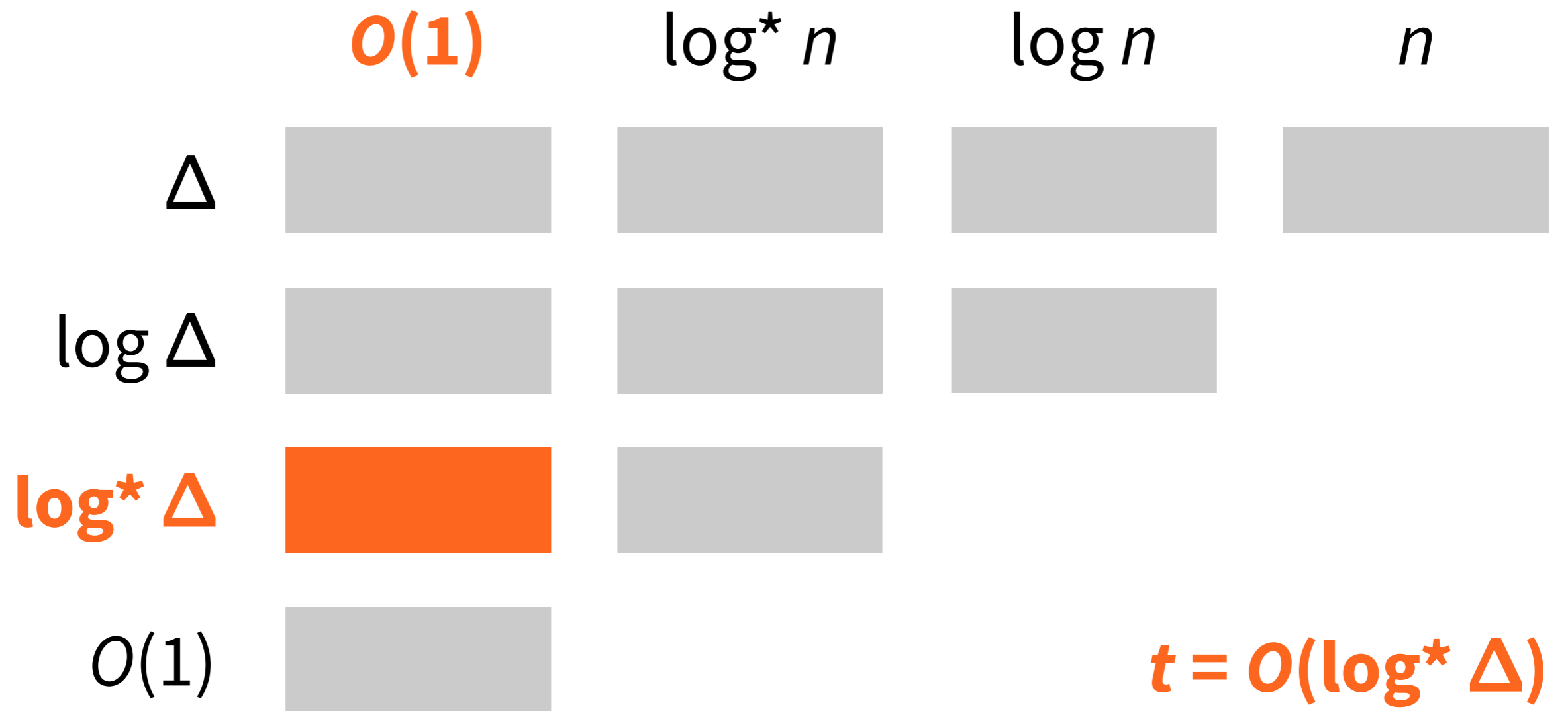
# Landscape













# Landscape



# Landscape













# Landscape

	$O(1)$	$\log^* n$	$\log n$	$n$
$\Delta$				
$\log \Delta$				
$\log^* \Delta$				
$O(1)$				













# Landscape

	$O(1)$	$\log^* n$	$\log n$	$n$
$\Delta$				
$\log \Delta$				
$\log^* \Delta$				
$O(1)$				











**All problems**

# Landscape

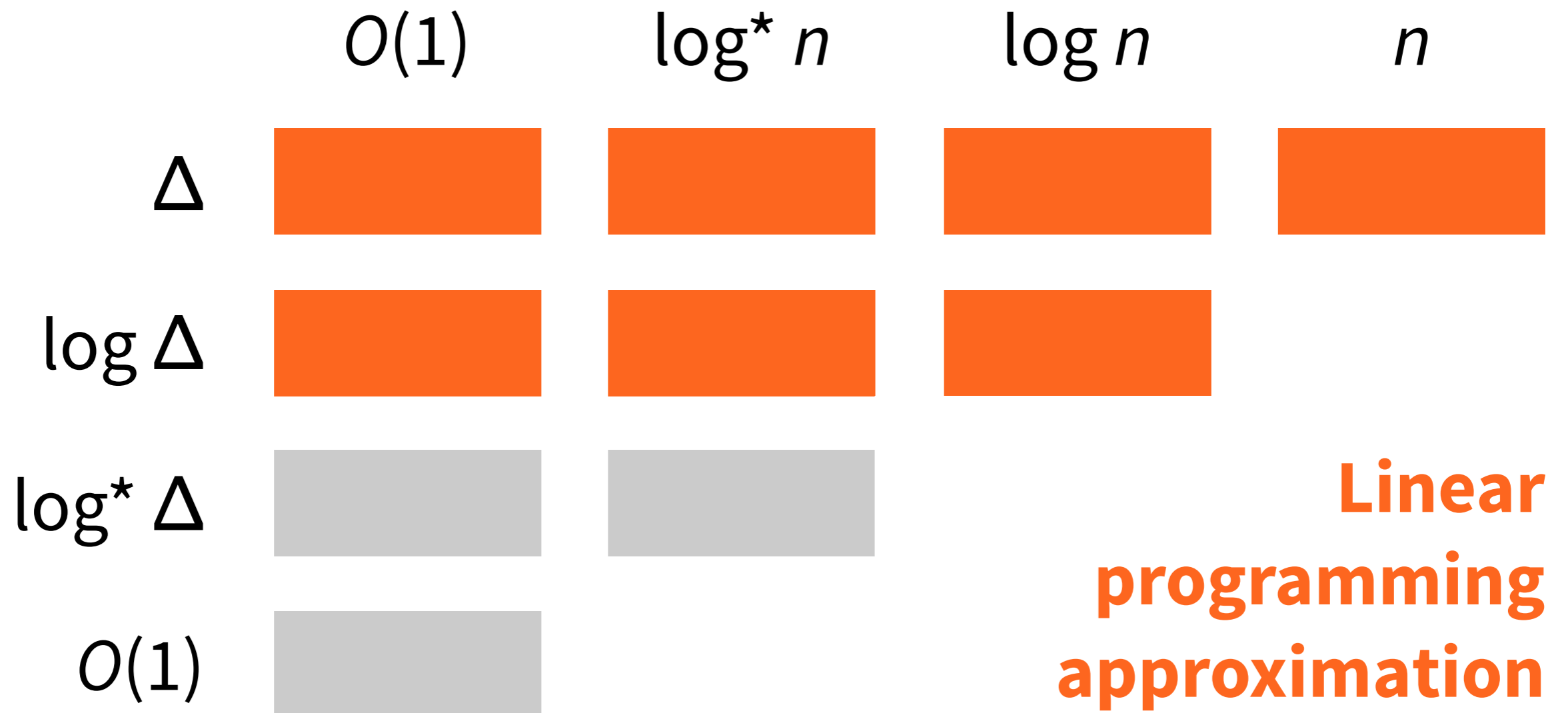
	$O(1)$	$\log^* n$	$\log n$	$n$
$\Delta$				
$\log \Delta$				
$\log^* \Delta$				
$O(1)$				

**Maximal matching**











# Landscape

	$O(1)$	$\log^* n$	$\log n$	$n$
$\Delta$				
$\log \Delta$				
$\log^* \Delta$				<b>Bipartite maximal matching</b>
$O(1)$				

# Landscape

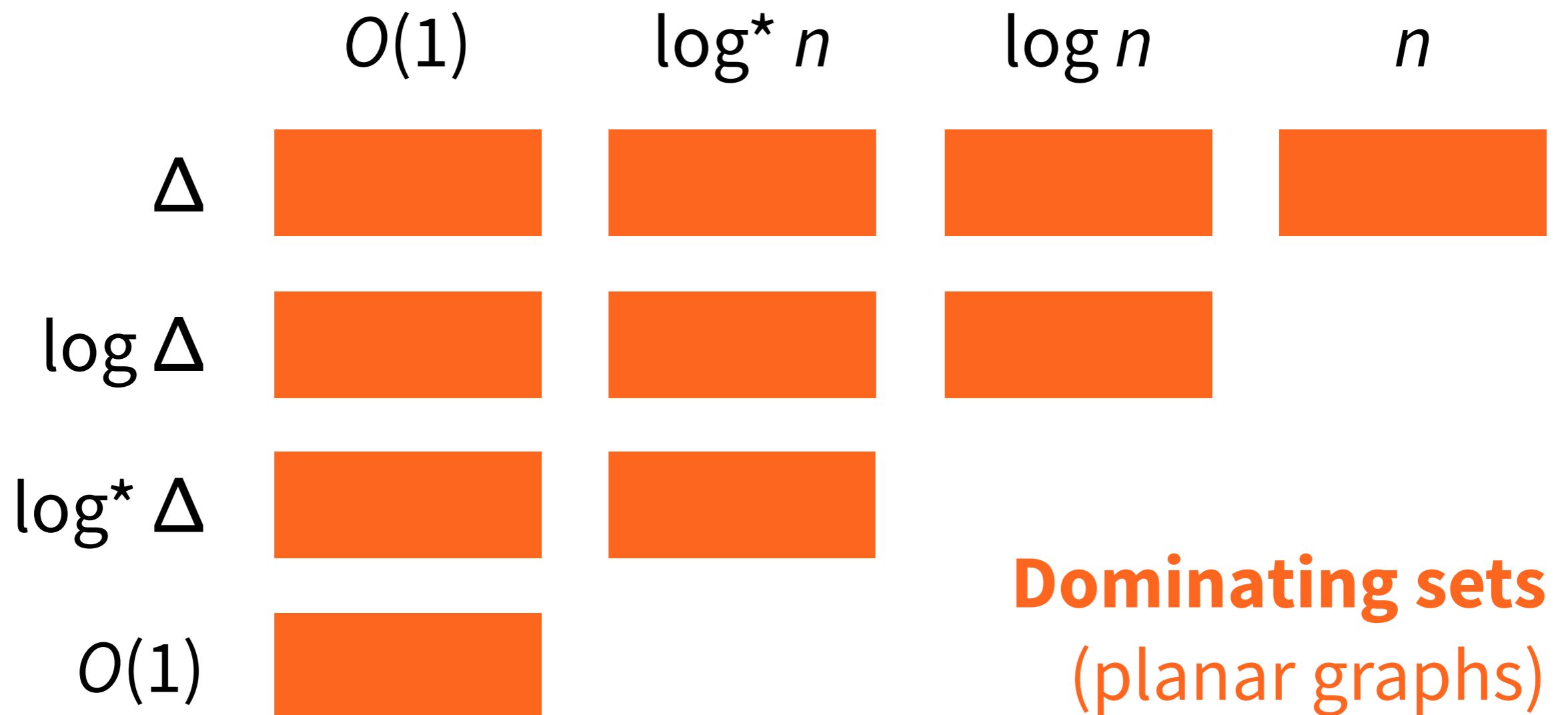


# Landscape

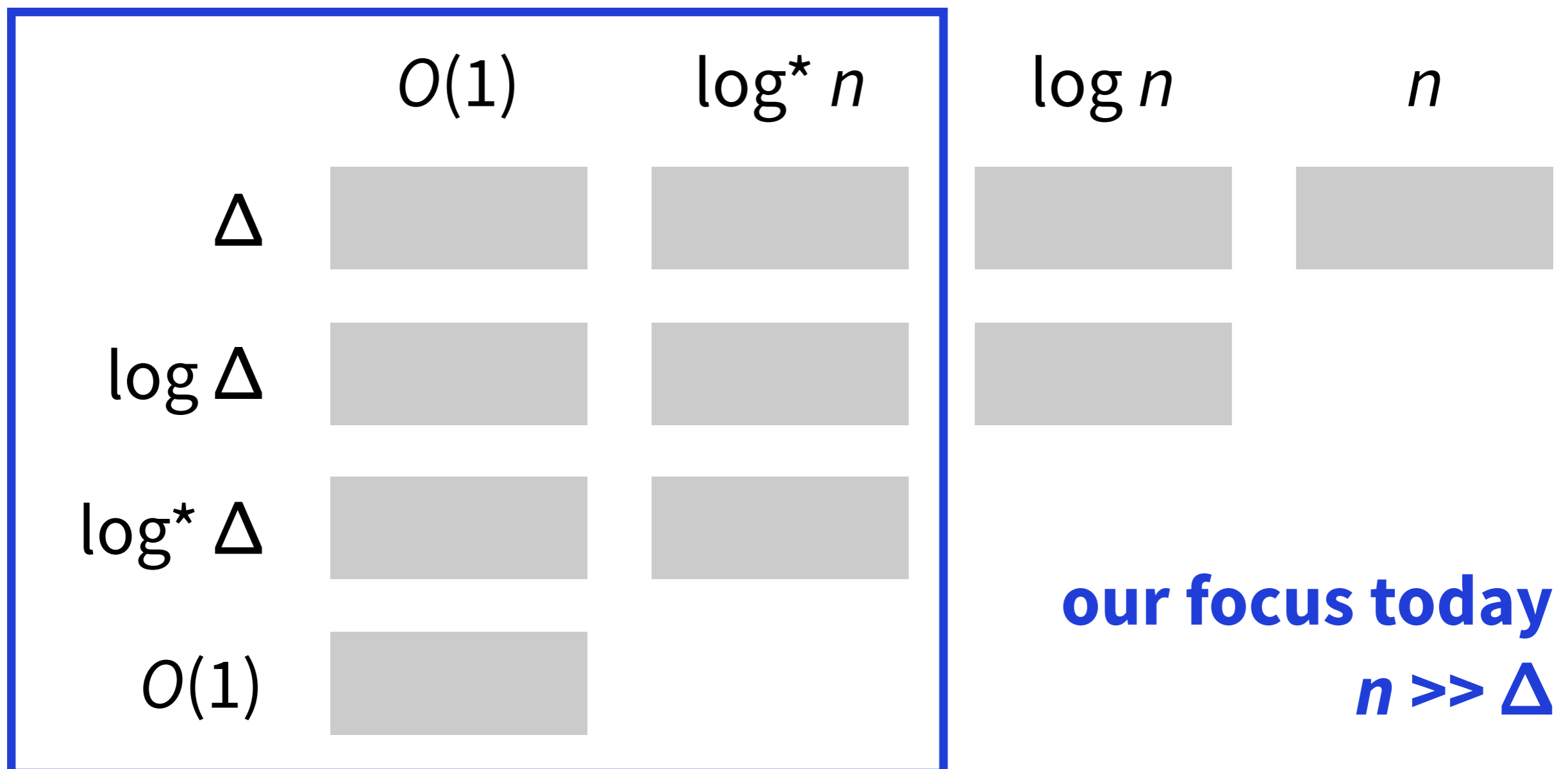
	$O(1)$	$\log^* n$	$\log n$	$n$
$\Delta$				
$\log \Delta$				
$\log^* \Delta$				
$O(1)$				

**Weak colouring**  
(odd-degree graphs)

# Landscape



# Landscape



# Typical state of the art

	$O(1)$	$\log^* n$	
$\Delta$	<b>no</b>	<b>yes</b>	positive: $O(\log^* n)$
$\log \Delta$			<b>tight bounds</b>
$\log^* \Delta$			<b>as a function of <math>n</math></b>
$O(1)$			negative: $o(\log^* n)$



# Typical state of the art

	$O(1)$	$\log^* n$	
$\Delta$	yes		positive: $O(\Delta)$
$\log \Delta$	???		<b>exponential gap as a function of <math>\Delta</math></b>
$\log^* \Delta$	no		
$O(1)$			negative: $o(\log \Delta)$

# Typical state of the art

	$O(1)$	$\log^* n$	
$\Delta$	yes		positive: $O(\Delta)$
$\log \Delta$	????		exponential gap as a function of $\Delta$ — or much worse
$\log^* \Delta$			
$O(1)$			negative: nothing

**fairly well  
understood**



$O(1)$

$\log^* n$

$\Delta$



$\log \Delta$



$\log^* \Delta$



$O(1)$



**poorly  
understood**



# Example:

# **LP approximation**

- **$O(\log \Delta)$ : possible**
  - Kuhn et al. (2004, 2006)
- **$o(\log \Delta)$ : not possible**
  - Kuhn et al. (2004, 2006)

# Example:

# Maximal matching

- $O(\Delta + \log^* n)$ : possible
  - Panconesi & Rizzi (2001)
- $O(\Delta) + o(\log^* n)$ : not possible
  - Linial (1992)
- $o(\Delta) + O(\log^* n)$ : unknown

# Example: **$(\Delta+1)$ -colouring**

- **$O(\Delta + \log^* n)$ : possible**
  - Barenboim & Elkin (2008), Kuhn (2008)
- **$O(\Delta) + o(\log^* n)$ : not possible**
  - Linial (1992)
- **$o(\Delta) + O(\log^* n)$ : unknown**

# Example: **Bipartite maximal matching**

- **$O(\Delta)$ : trivial**
  - Hańćkowiak et al. (1998)
- **$o(\Delta)$ : unknown**

# Example:

# **Semi-matching**

- **$O(\Delta^5)$ : possible**
  - Czygrinow et al. (2012)
- **$o(\Delta^5)$ : unknown**



# Example:

# **Semi-matching**

- **$O(\Delta^5)$ : possible**
  - Czygrinow et al. (2012)
- **$o(\Delta^5)$ : unknown**
- **$o(\Delta)$ : unknown**

# Example:

# **Weak colouring**

- **$O(\log^* \Delta)$ : possible** (in odd-degree graphs)
  - Naor & Stockmeyer (1995)
- **$o(\log^* \Delta)$ : unknown**

**fairly well  
understood**



$O(1)$

$\log^* n$

$\Delta$



$\log \Delta$



$\log^* \Delta$



$O(1)$



**poorly  
understood**



# Orthogonal challenges?

- **$n$ : “symmetry breaking”**
  - fairly well understood
  - Cole & Vishkin (1986), Linial (1992), Ramsey theory ...
- **$\Delta$ : “local coordination”**
  - poorly understood

*“symmetry  
breaking”*



$O(1)$

$\log^* n$

$\Delta$



$\log \Delta$



$\log^* \Delta$



$O(1)$



*“local  
coordination”*



# Orthogonal challenges

- **Example: maximal matching,  $O(\Delta + \log^* n)$**
- **Restricted versions:**
  - pure symmetry breaking,  $O(\log^* n)$
  - pure local coordination,  $O(\Delta)$

# Orthogonal challenges

- **Example: maximal matching,  $O(\Delta + \log^* n)$**
- **Pure symmetry breaking:**
  - input = cycle
  - no need for local coordination
  - $O(\log^* n)$  is possible and tight

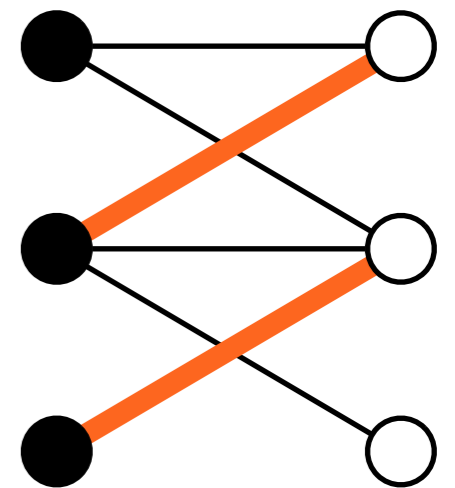
# Orthogonal challenges

- **Example: maximal matching,  $O(\Delta + \log^* n)$**
- **Pure local coordination:**
  - input = 2-coloured graph
  - no need for symmetry breaking
  - $O(\Delta)$  is possible — is it tight?



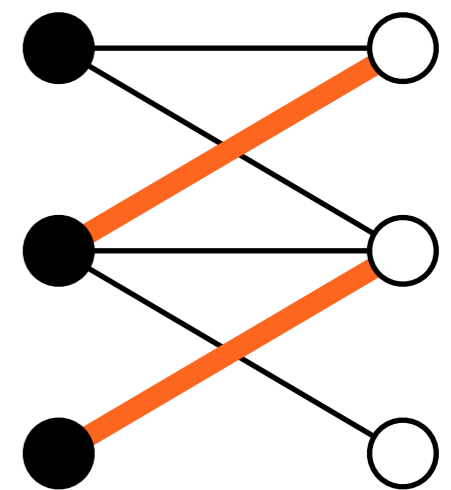
# Maximal matching in 2-coloured graphs

- **Trivial algorithm:**
  - black nodes send proposals to their neighbours, one by one
  - white nodes accept the first proposal that they get
- **“Coordination”  $\approx$  one by one traversal**



# Maximal matching in 2-coloured graphs

- **Trivial algorithm:**
  - black nodes send proposals to their neighbours, one by one
  - white nodes accept the first proposal that they get
- **Clearly  $O(\Delta)$ , but is this tight?**



# Maximal matching in 2-coloured graphs

- **General case:**

- upper bound:  $O(\Delta)$
- lower bound:  $\Omega(\log \Delta)$  — Kuhn et al.

- **Regular graphs:**

- upper bound:  $O(\Delta)$
- lower bound: nothing!

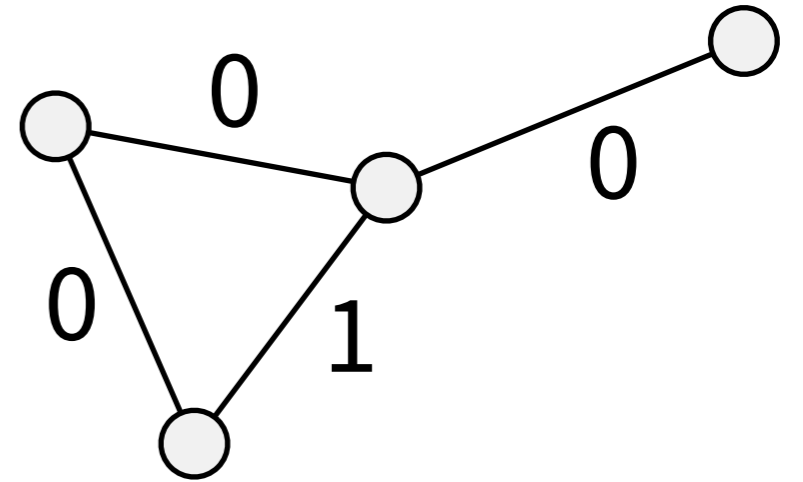
# Linear-in- $\Delta$ bounds

- **Many combinatorial problems seem to require “local coordination”, takes  $O(\Delta)$  time?**
- **Lacking: linear-in- $\Delta$  lower bounds**
  - known for restricted algorithm classes (Kuhn & Wattenhofer 2006)
  - not previously known for the LOCAL model

# Recent progress

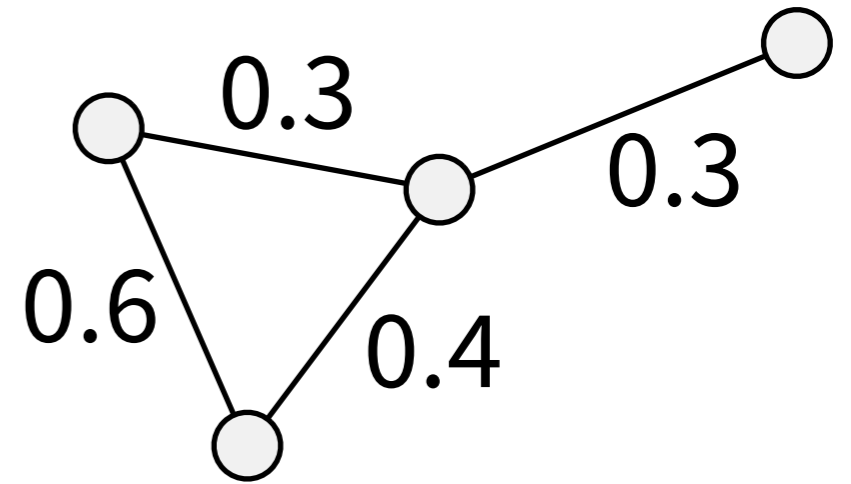
- **Maximal *fractional* matching**
- **$O(\Delta)$ : possible**
  - SPAA 2010
- **$o(\Delta)$ : not possible**
  - PODC 2014

# Matching



- **Edges labelled with integers  $\{0, 1\}$**
- **Sum of incident edges at most 1**
- **Maximal matching:**  
cannot increase the value of any label

# Fractional matching



- Edges labelled with real numbers  $[0, 1]$
- Sum of incident edges at most 1
- Maximal **fractional** matching:  
cannot increase the value of any label

# Maximal fractional matching

- **Possible in time  $O(\Delta)$** 
  - does **not** require symmetry breaking
  - $d$ -regular graph: label all edges with  $1/d$
- **Nontrivial part:** graphs that are not regular...

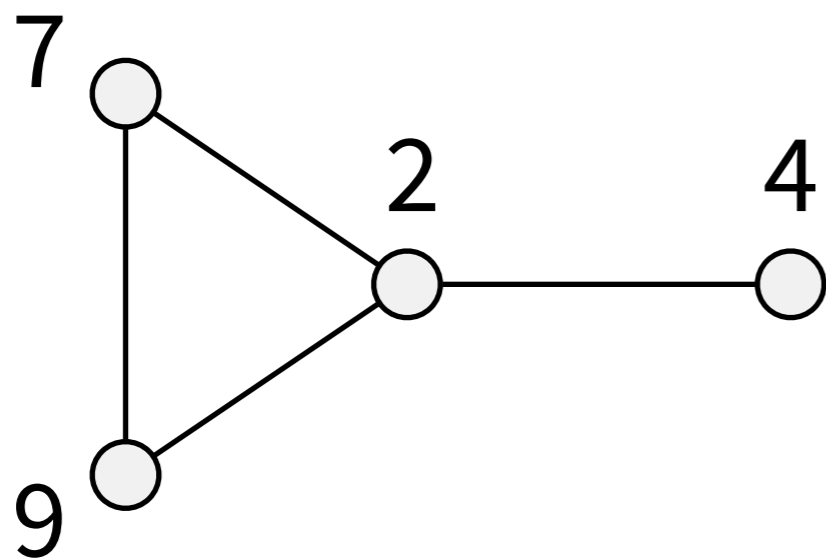


# Maximal fractional matching

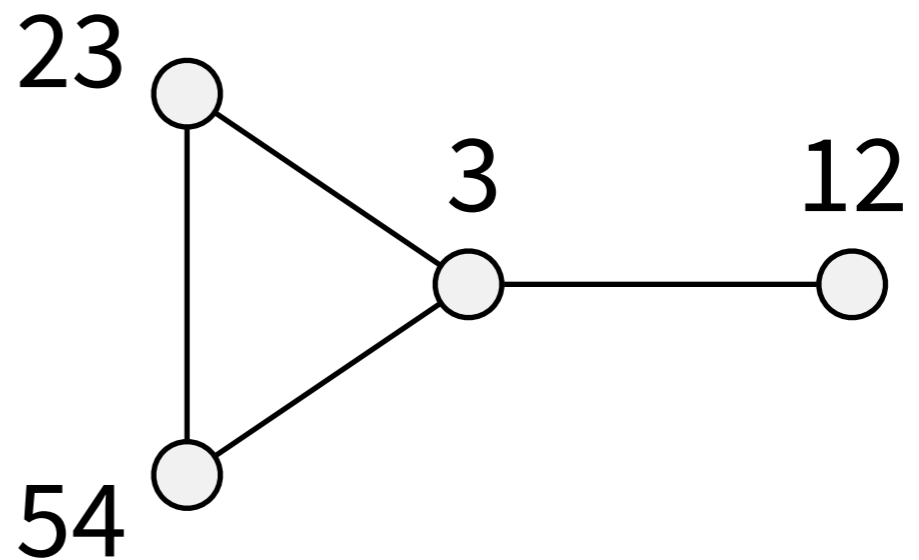
- **Not possible in time  $o(\Delta)$ , independently of  $n$** 
  - note: we do not say anything about e.g. possibility of solving in time  $o(\Delta) + O(\log^* n)$
- **Key ingredient of the proof:**  
analyse many **different models** of distributed computing

# ID: unique identifiers

Nodes have unique identifiers,  
output **may depend on them**

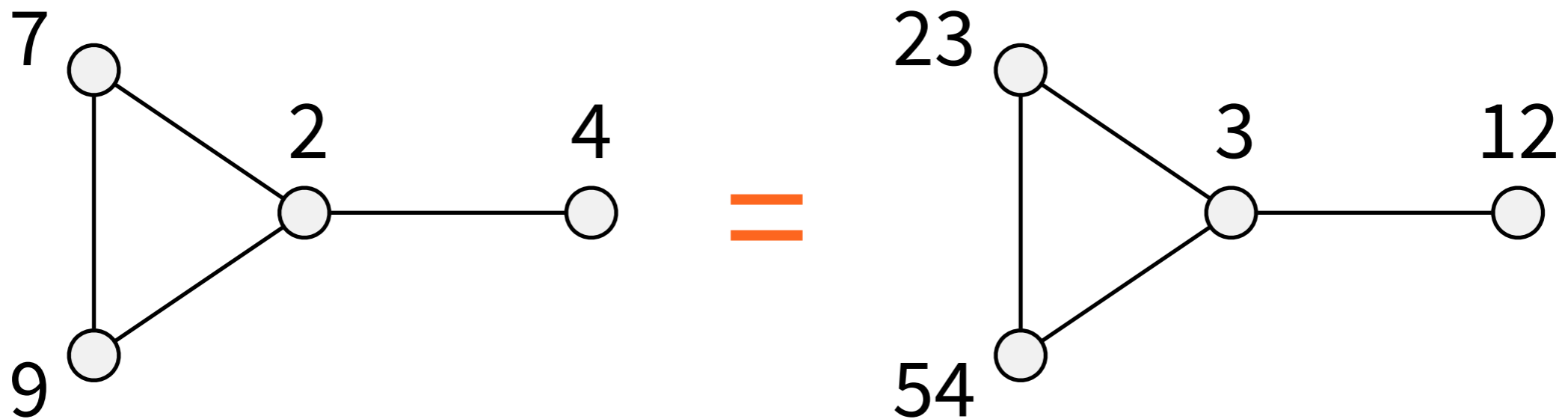


≠



# OI: order invariant

Output does not change if we change identifiers but keep their **relative order**

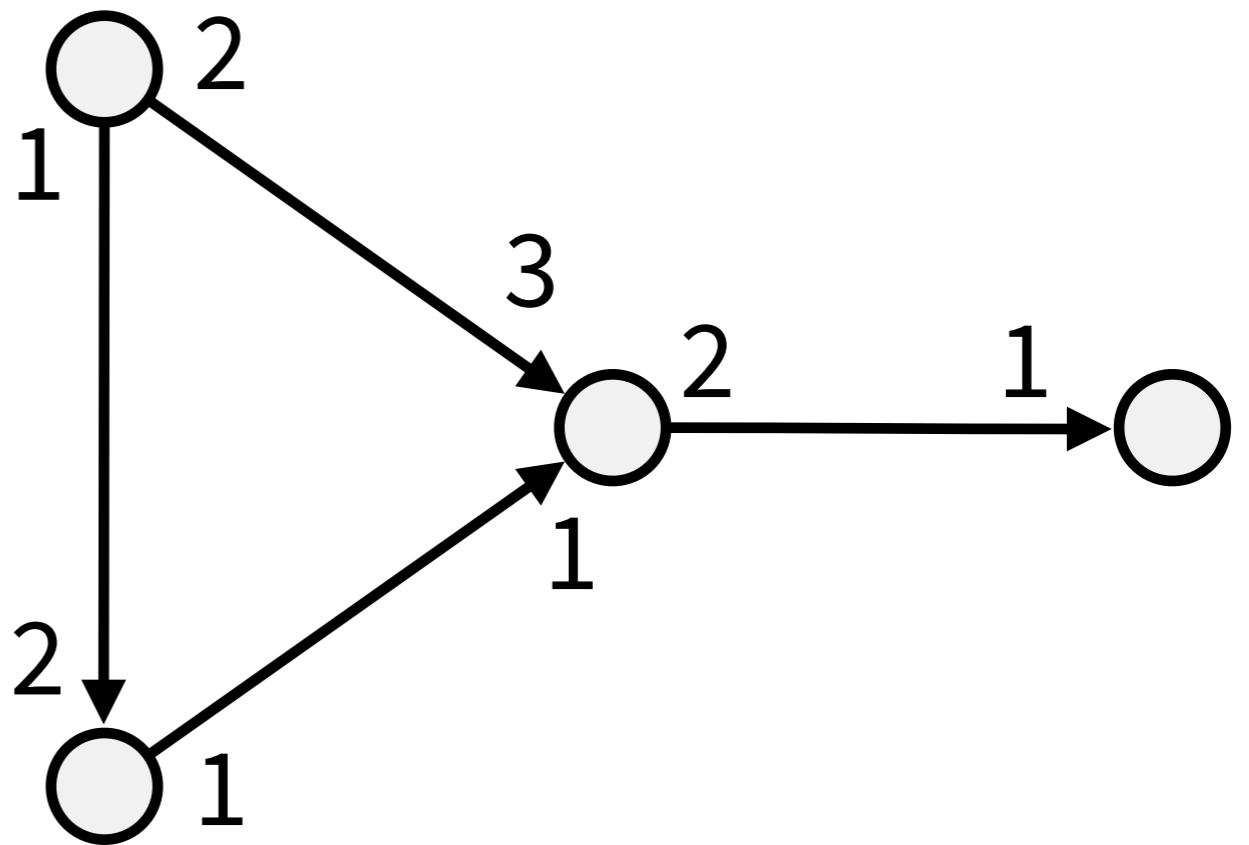


# PO: ports & orientation

**No identifiers**

**Node  $v$  labels  
incident edges  
with  $1, \dots, \text{deg}(v)$**

**Edges oriented**

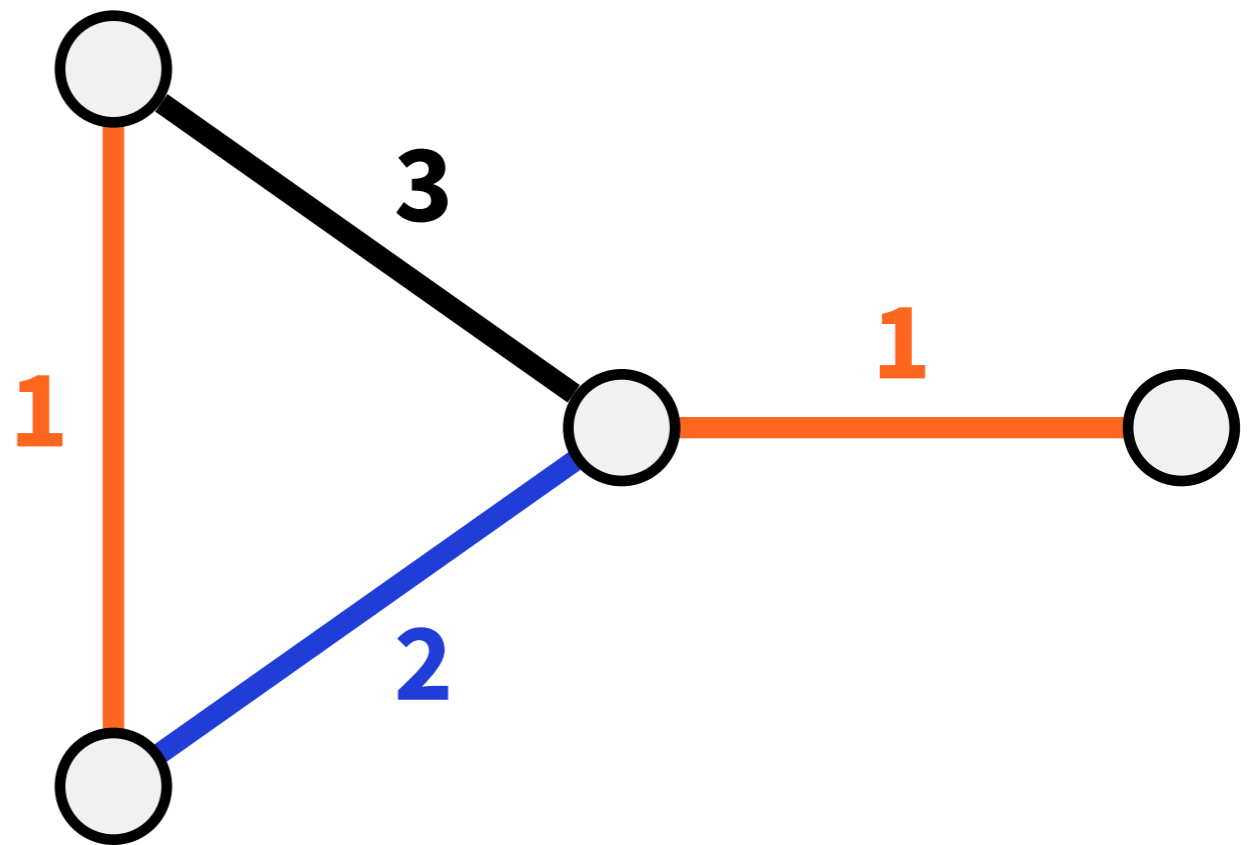


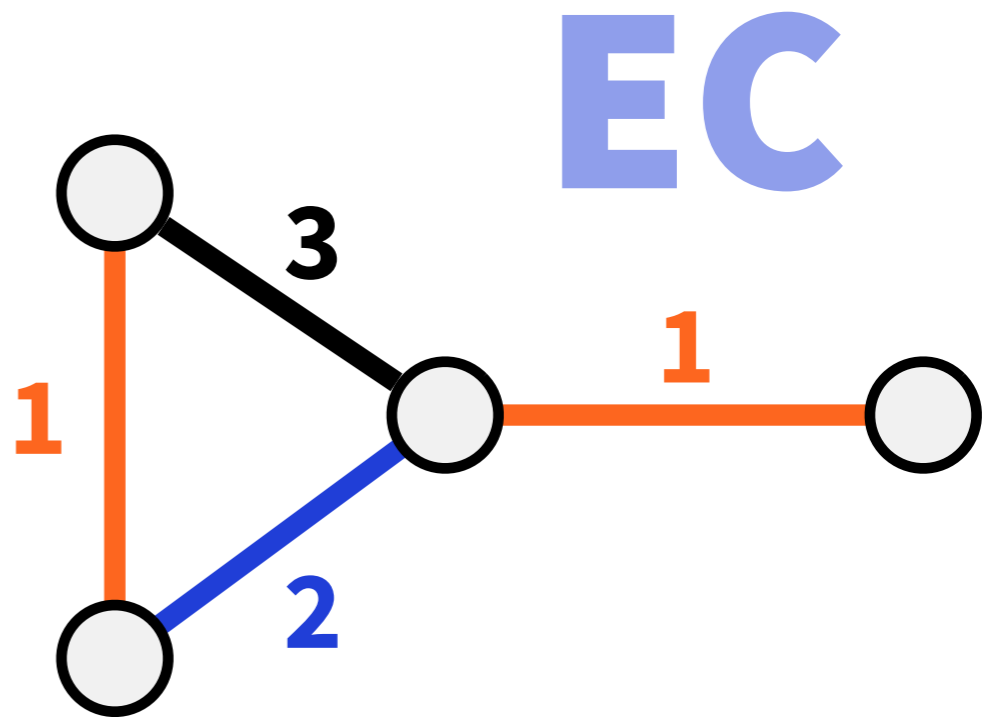
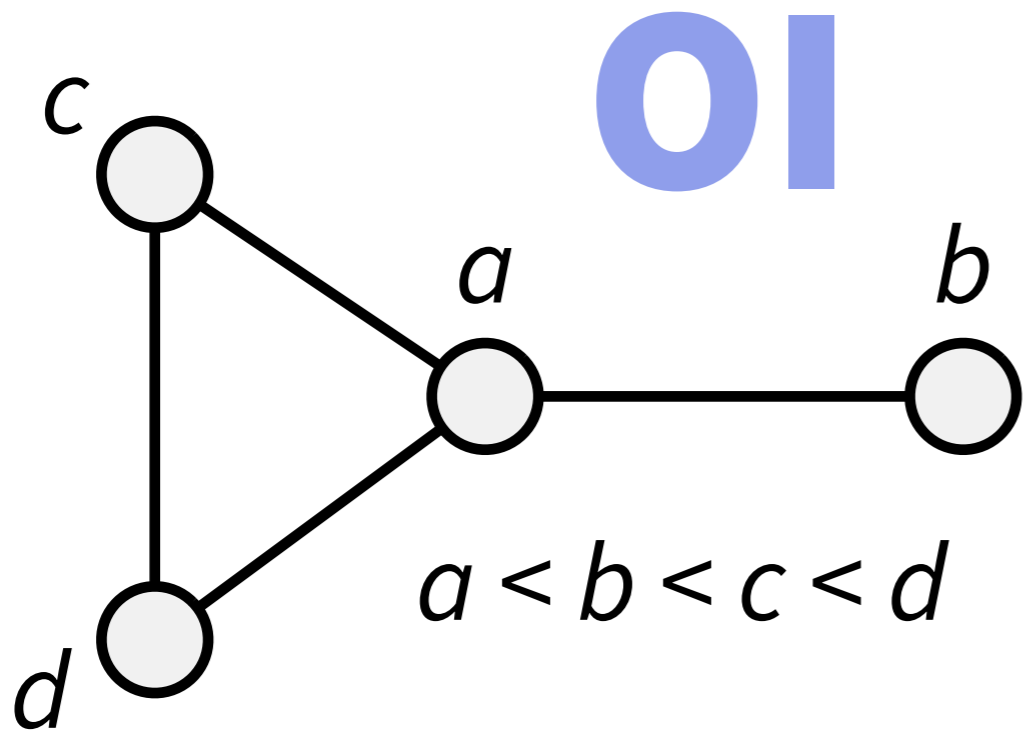
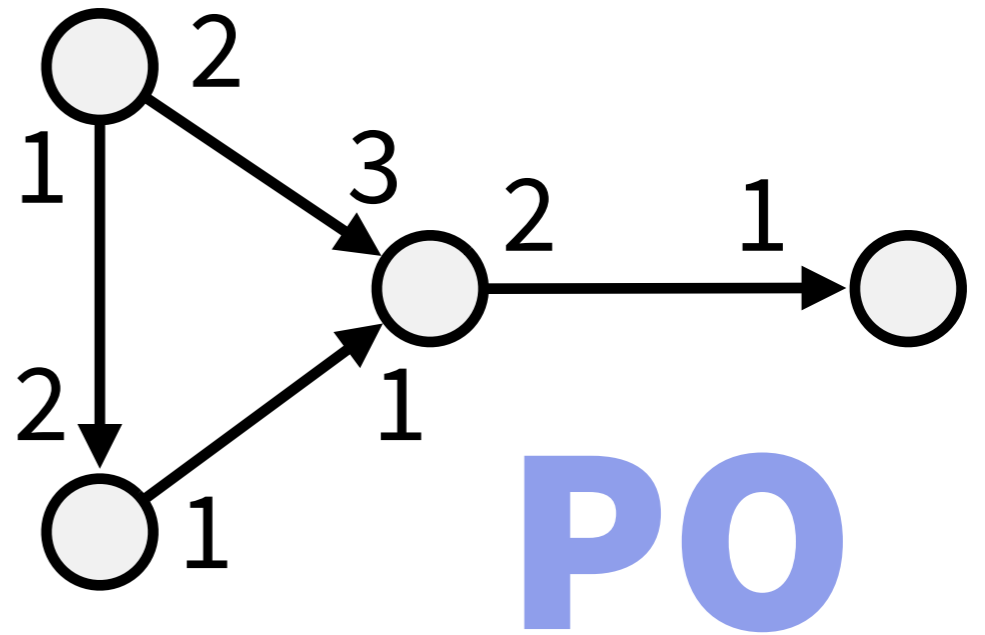
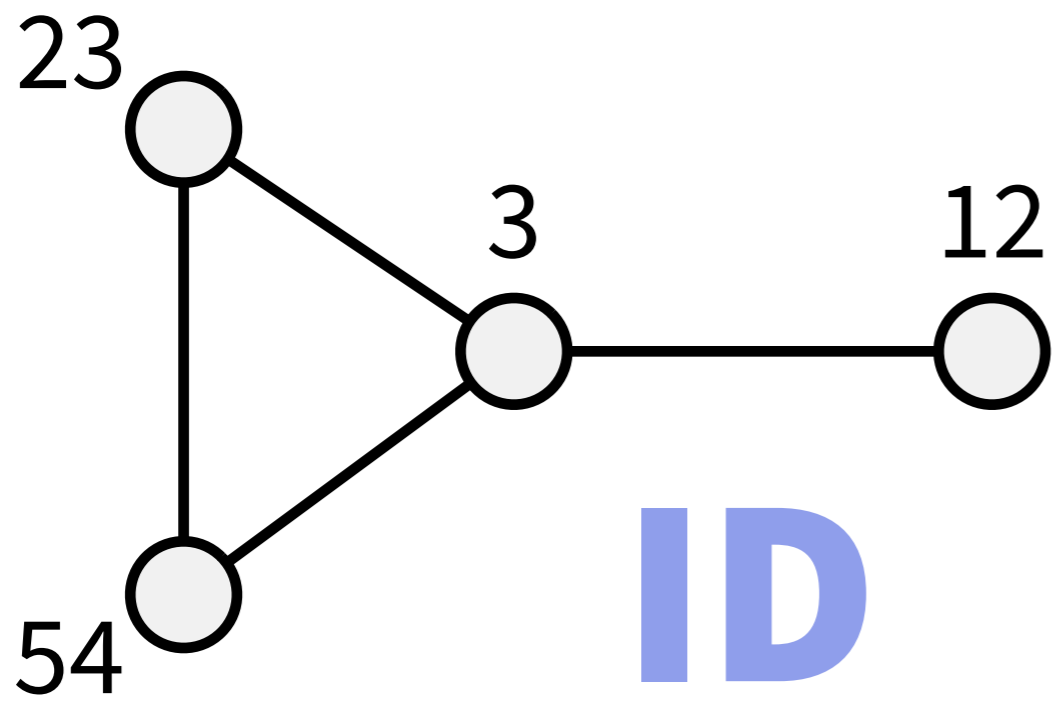
# EC: edge colouring

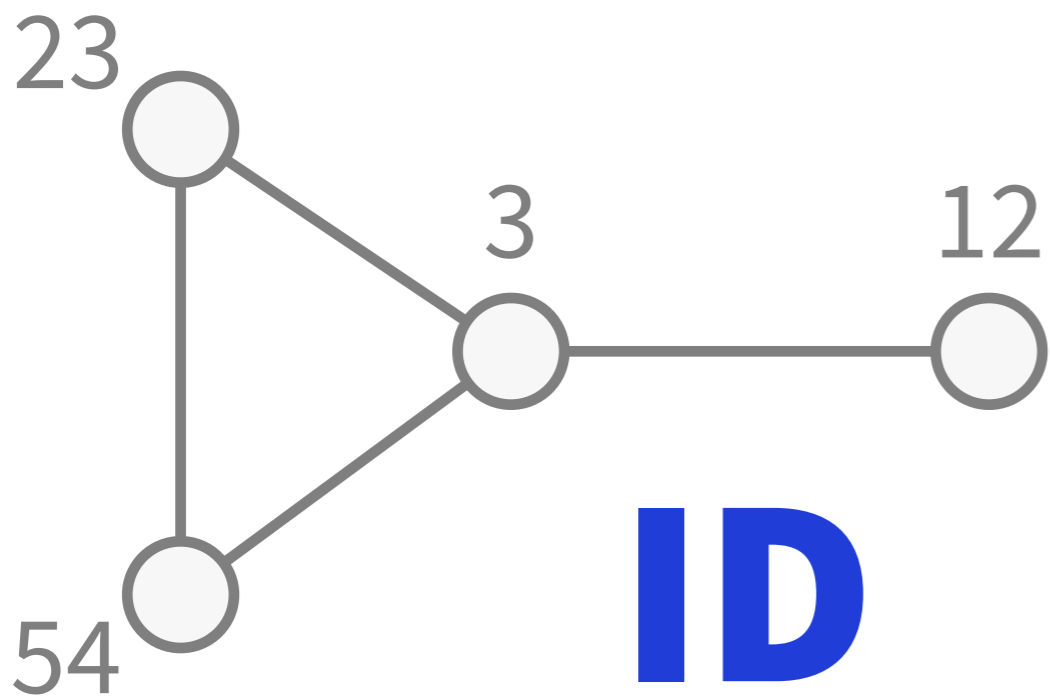
**No identifiers**

**No orientations**

**Edges coloured**  
with  $O(\Delta)$  colours



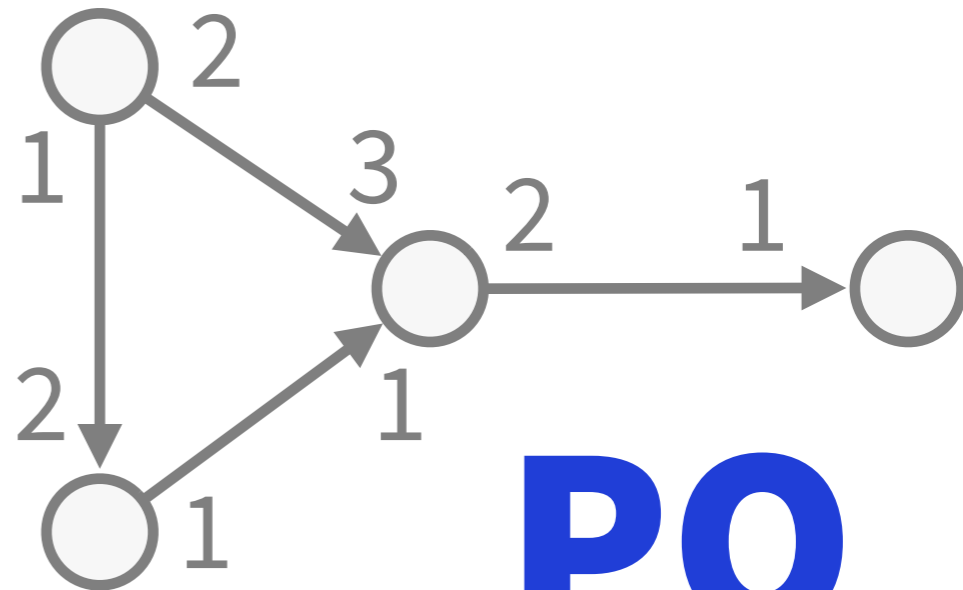
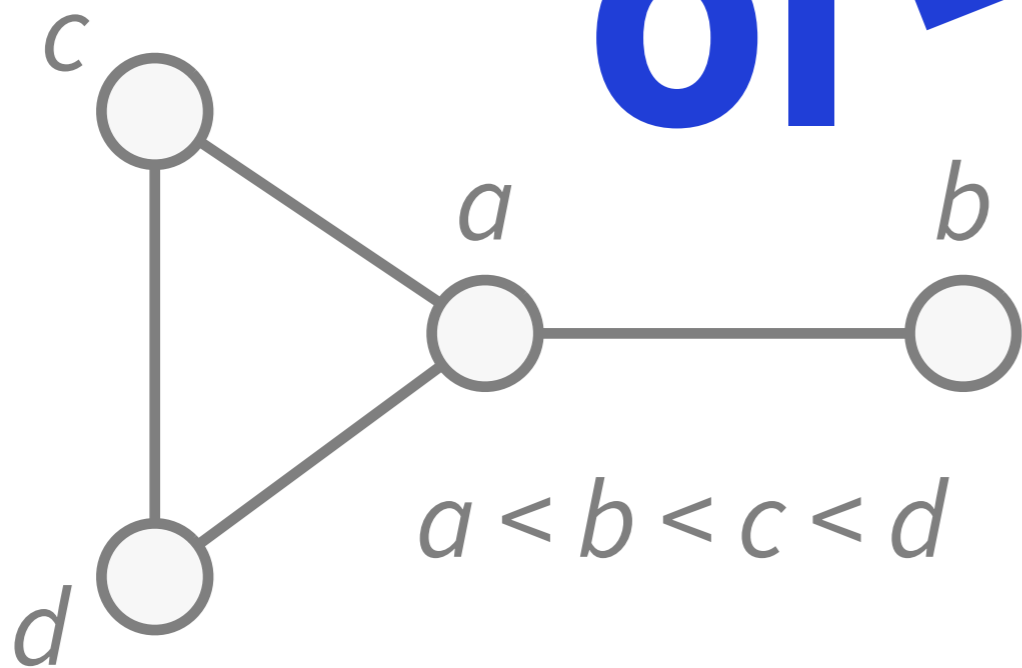




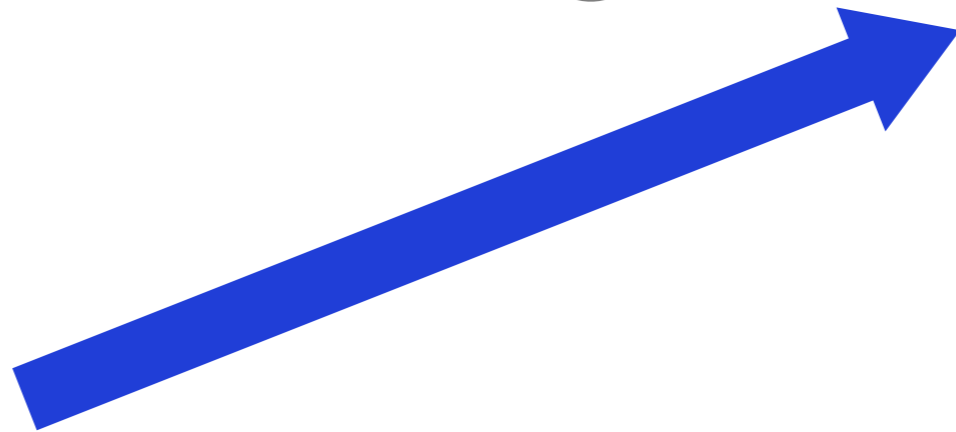
**ID**



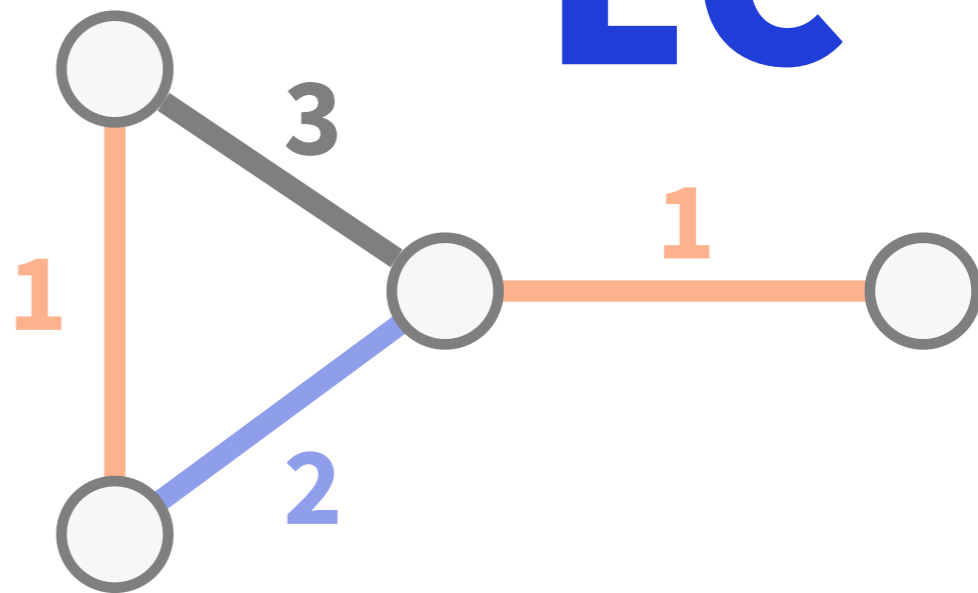
**OI**



**PO**



**EC**



# Simulation argument

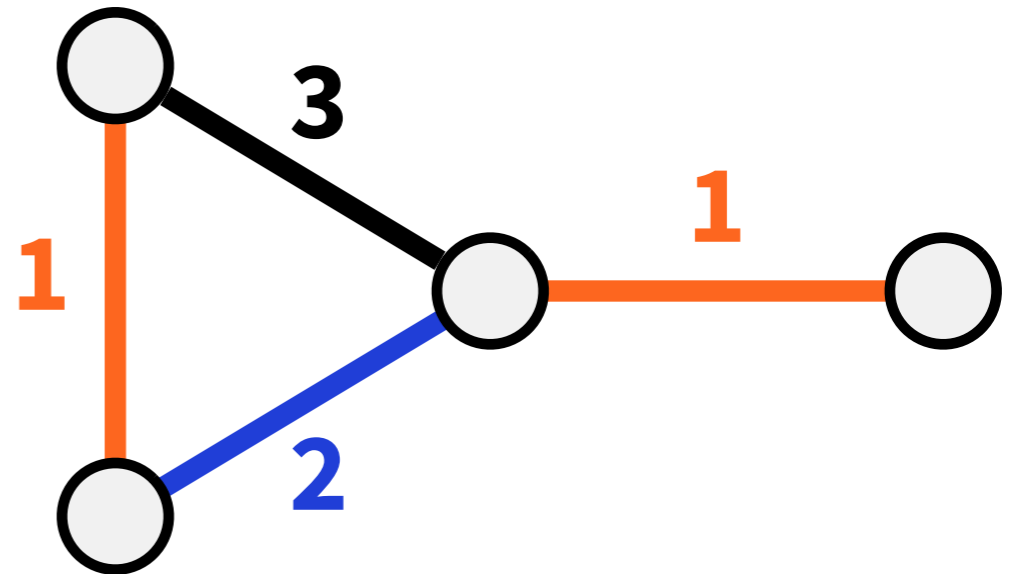
- **Trivial:  $ID \rightarrow OI \rightarrow PO$** 
  - for any problem
- **We show:  $EC \rightarrow PO \rightarrow OI \rightarrow ID$** 
  - for maximal fractional matching in “loopy graphs”



# Proof overview

- **EC model is very limited**
  - maximal fractional matching requires  $\Omega(\Delta)$  time in EC, even for “loopy graphs”
- **Simulation argument: EC  $\rightarrow$  PO  $\rightarrow$  OI  $\rightarrow$  ID**
  - maximal fractional matching requires  $\Omega(\Delta)$  time in ID, at least for “loopy graphs”

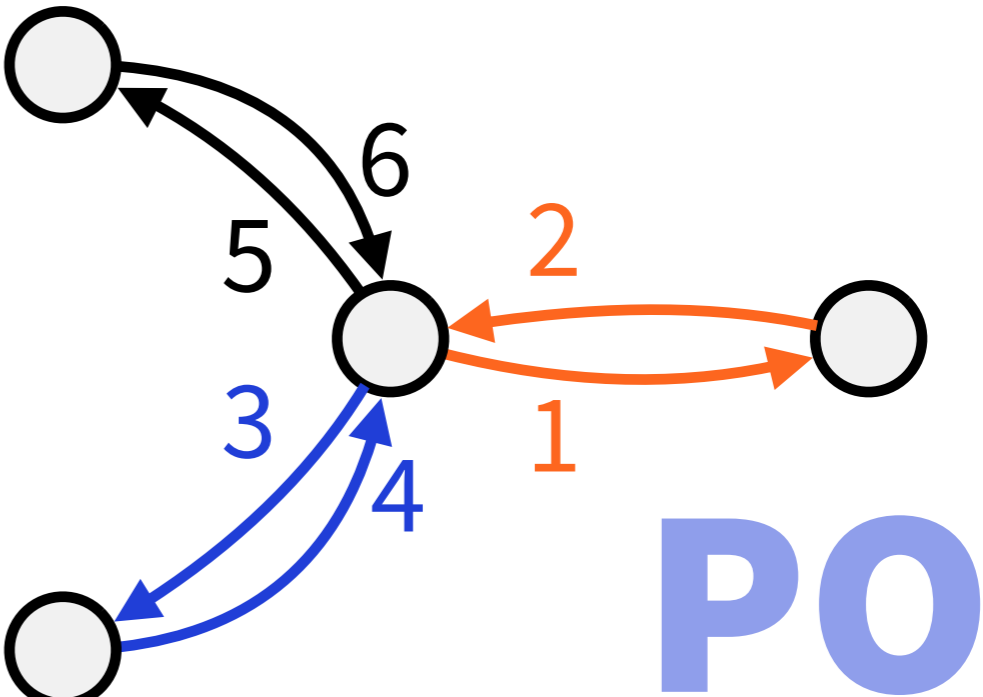
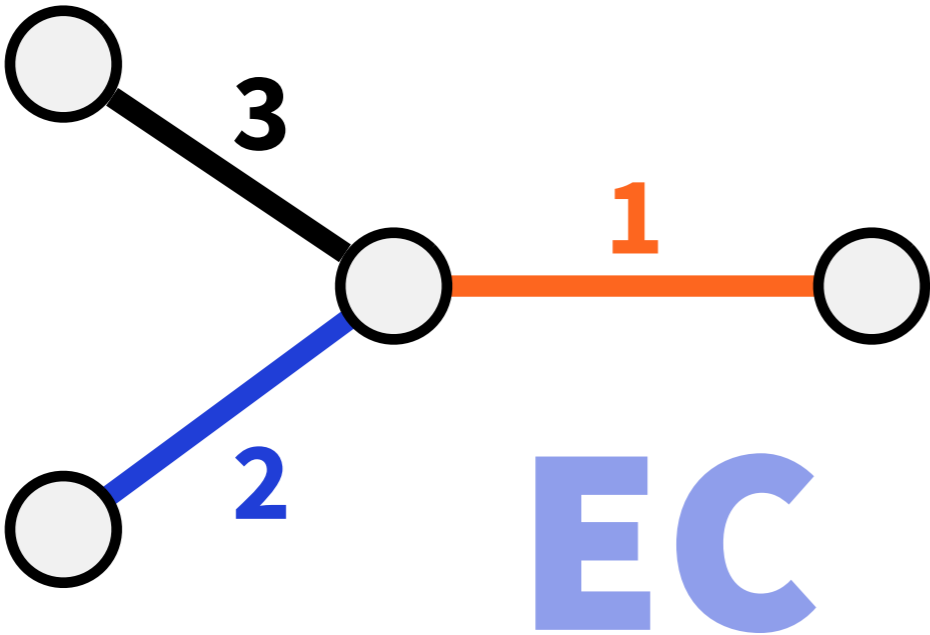
# EC



- **Recursively construct a degree- $i$  graph where this algorithm takes time  $i$**
- **Focus on “loopy graphs”**
  - highly symmetric
  - forces algorithm to produce “tight” outputs (all nodes saturated, “perfect matching”)

# EC → PO

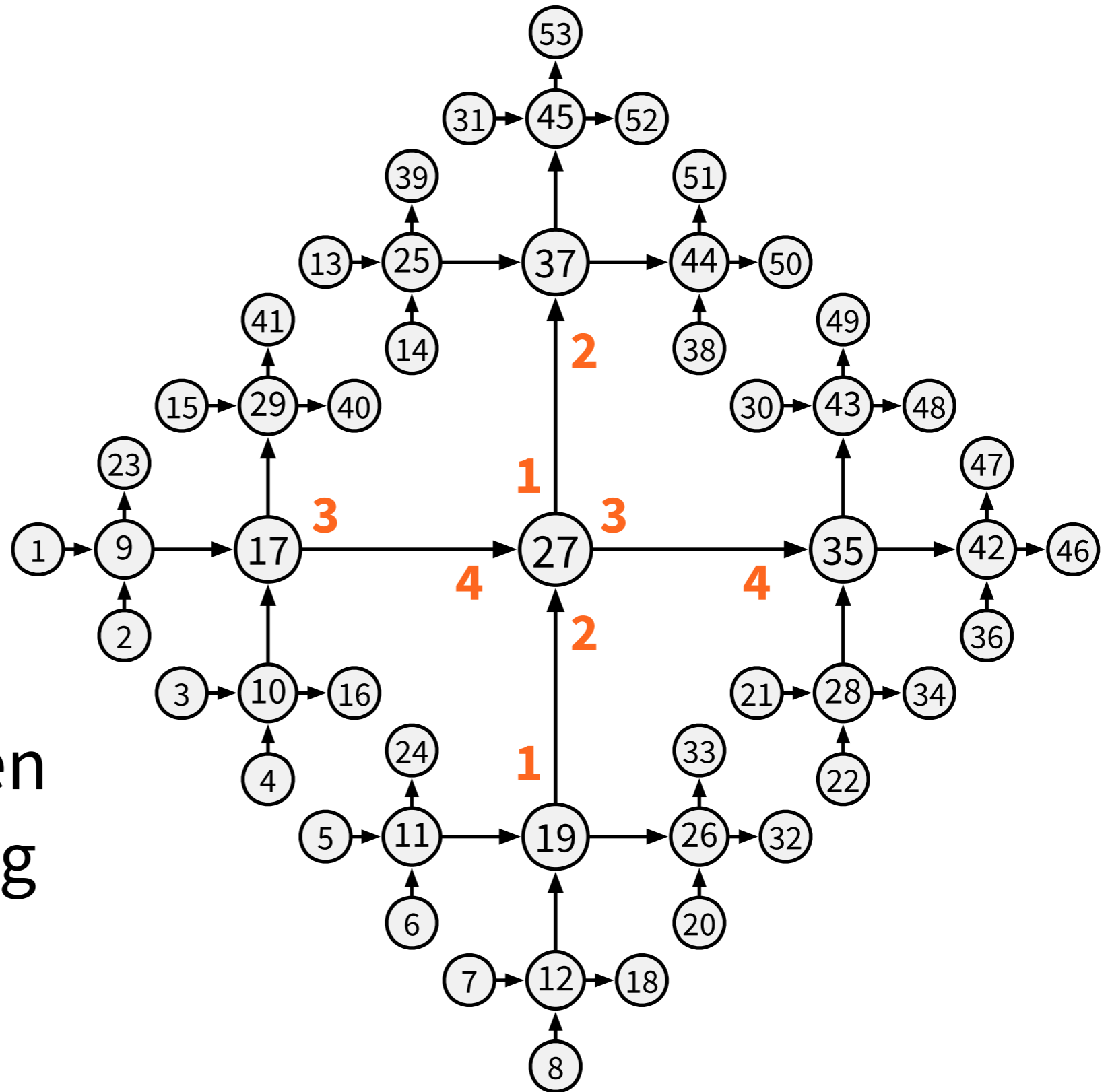
“Unhelpful” port numbering & orientation



**PO → OI**

**“Unhelpful”  
total order**

can be easily  
constructed given  
a port numbering  
and orientation



**OI → ID**

**“Unhelpful” unique identifiers**

**Ramsey-like argument:**

for any algorithm we can find unique identifiers that do not help in comparison with total order

**EC → PO → OI → ID**

- **In general:** stronger models help
- **In our case:** we can always come up with situations in which ID model is not any better than EC model

# What about other problems?

- **Now we have a linear-in- $\Delta$  lower bound for maximal fractional matching**
- **Can we use the same techniques to prove lower bounds for other problems?**
  - e.g., maximal matching?

# General recipe

- 1. Find a suitable “simple model”**
- 2. Prove a lower bound for the simple model**
  - keep input “symmetric”
  - keep output “tight” and “fragile”
  - local changes have non-local consequences



# General recipe

- 1. Find a suitable “simple model”**
- 2. Prove a lower bound for the simple model**
- 3. Amplify the lower bound**
  - simple model  $\rightarrow$  OI (some thinking required)
  - OI  $\rightarrow$  ID (standard techniques)

# What about maximal matchings?

- Could we use the **same techniques** to show that  $o(\Delta) + O(\log^* n)$  is not sufficient for maximal matching?
- **Two obstacles...**

# What about maximal matchings?

- **Obstacle 1 – final step:**
  - final step  $OI \rightarrow ID$  based on a Ramsey argument
  - works great for  $t$  independent of  $n$
  - fails if  $t \approx \log^* n$

# What about maximal matchings?

- **Obstacle 2 – starting point:**
  - $O(\log^* n)$  time enough to find  
e.g. graph colouring
  - cannot assume “symmetric” input
  - difficult to force “tight” and “fragile” output

# What about maximal matchings?

- **Two hard, interlinked obstacles**
- **How to proceed:**
  - get rid of obstacle 1 —  $\log^* n$
  - focus on obstacle 2 — asymmetry
- **Start with bipartite maximal matchings**

# Maximal matching in 2-coloured graphs

- Can be solved in time  $O(\Delta)$  independently of  $n$
- Can focus on just one obstacle: **asymmetry**
- **Most of the other machinery already exists!**
  - we just need tight bounds for simple models
  - should be easy to generalise to LOCAL model

# Maximal matching in 2-coloured graphs

- **Until we have lower bounds:**  
**reductions, conditional lower bounds**
  - many other problems are at least as hard as bipartite maximal matching
  - locally optimal **semi-matching** in time  $T$   
→ bipartite maximal matching in time  $T$

# Summary

- **Distributed time complexity, LOCAL model**
- $O(\log^* n)$ : “**symmetry breaking**”, OK
- $O(\Delta)$ : “**local coordination**”, poorly understood
- Maximal *fractional* matching solved,  
next step: *bipartite* maximal matching