

# Recent Progress on Distributed CONGEST Algorithms for Specific Graph Classes

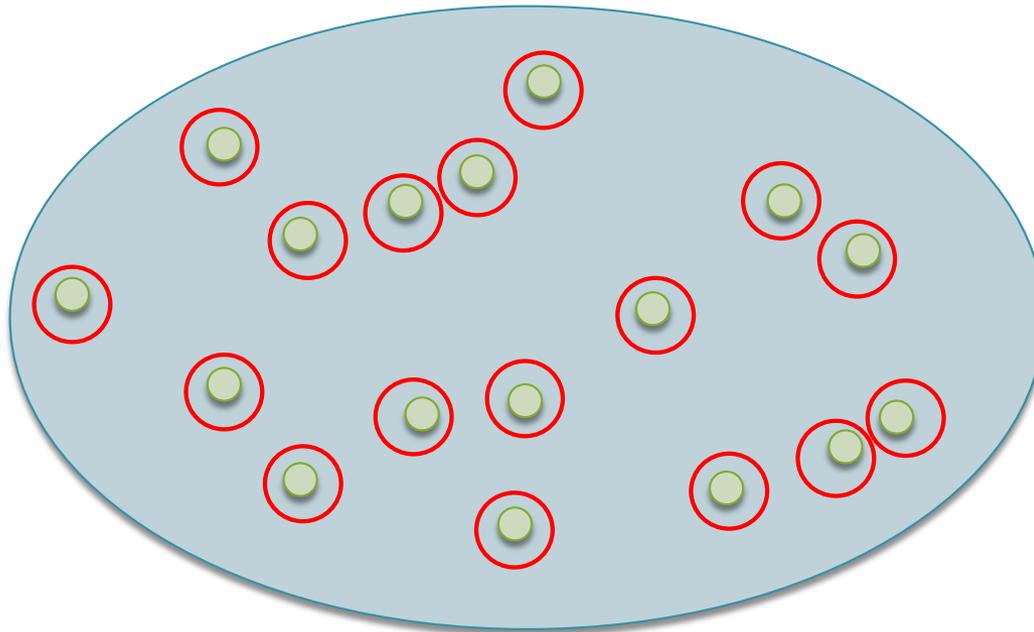
Taisuke Izumi(NITECH, Japan)

# Model

- CONGEST model
  - ▣ Round-based synchrony
  - ▣ Network is a graph  $G = (V(G), V(E))$  of  $n$  nodes
  - ▣ Each link transmits  $O(\log n)$  bits / round
    - Reliable
  
- Coping with low bandwidth is a primary difficulty
  - ▣ Many hardness results: MST, Diameter, Min-cut, etc.

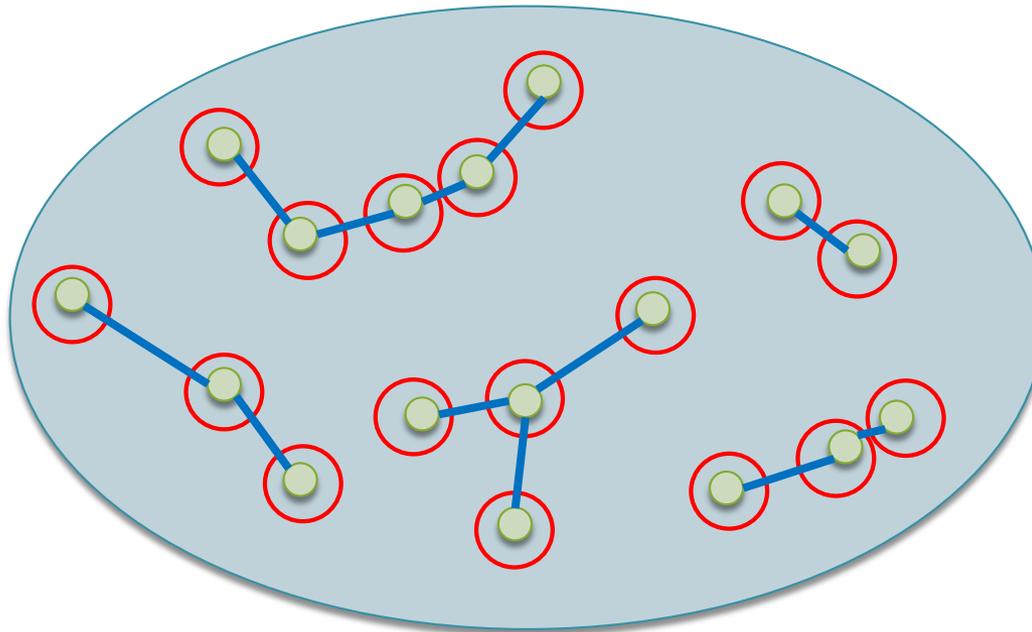
# Warm-up : MST

- Classical GHS algorithm (= Distributed Boruvka)
  - ▣ Growing the fragments of MST
    - Each fragment finds its minimum outgoing edge (MOE)



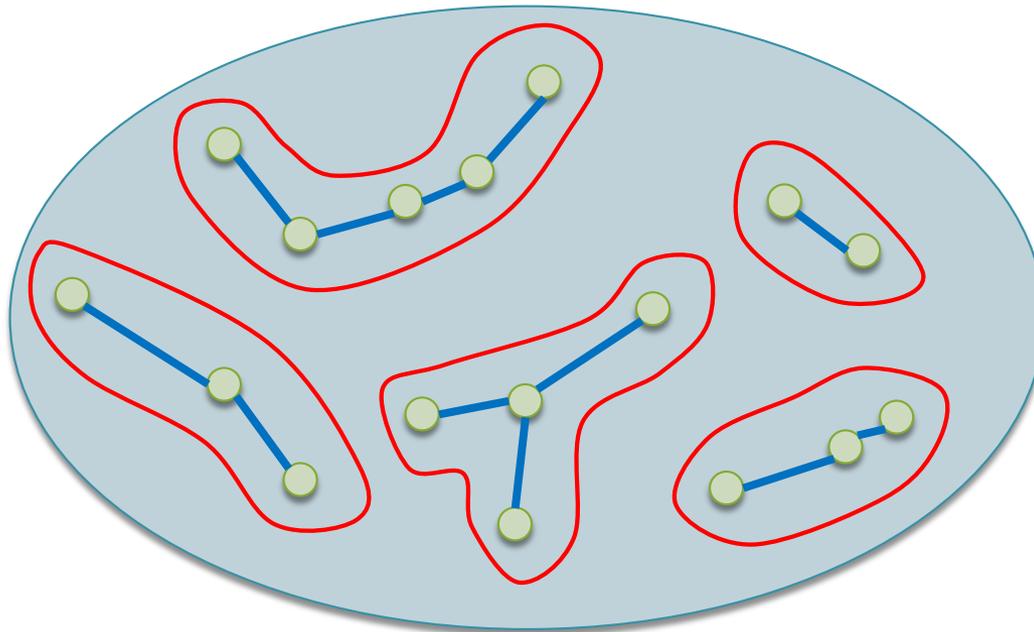
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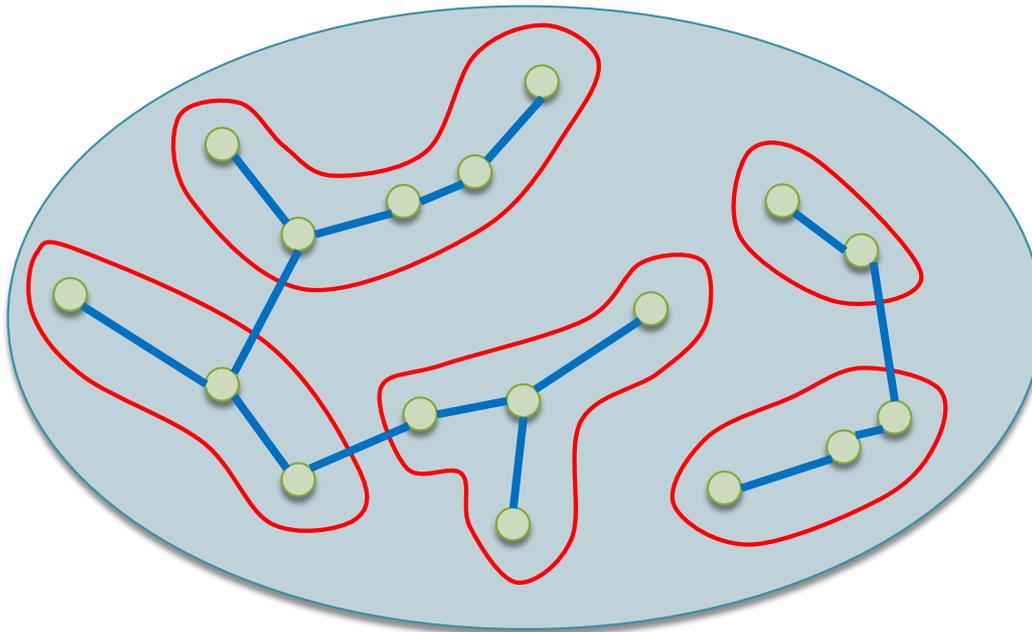
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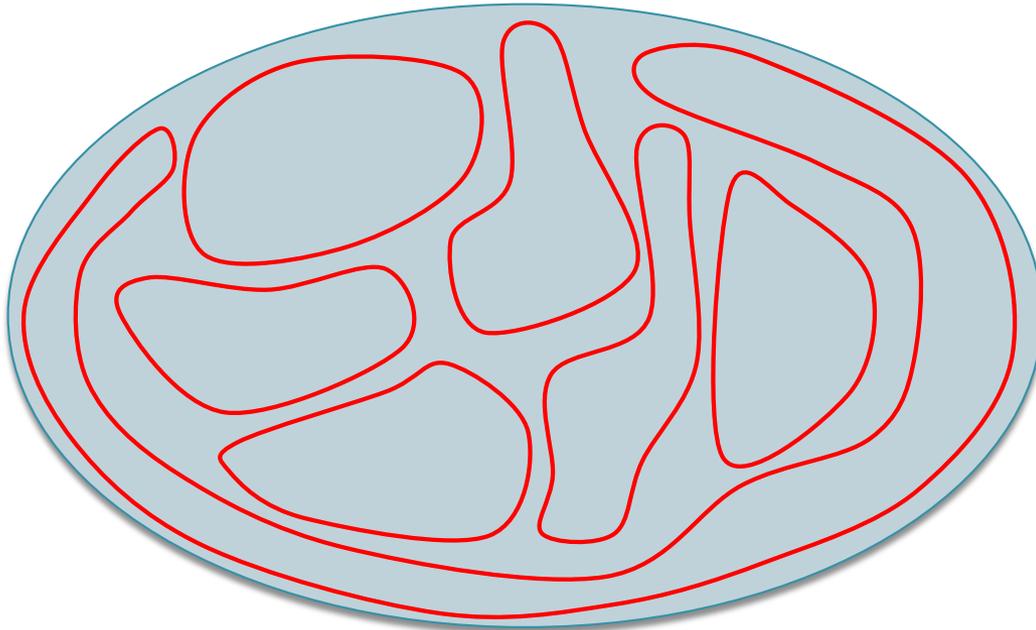
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# Warm-up : MST

- Finding MOEs is not necessarily fast
  - ▣ Even if the diameter of graph  $G$  is  $D \ll n$ , a fragment can have an  $\Omega(n)$  diameter

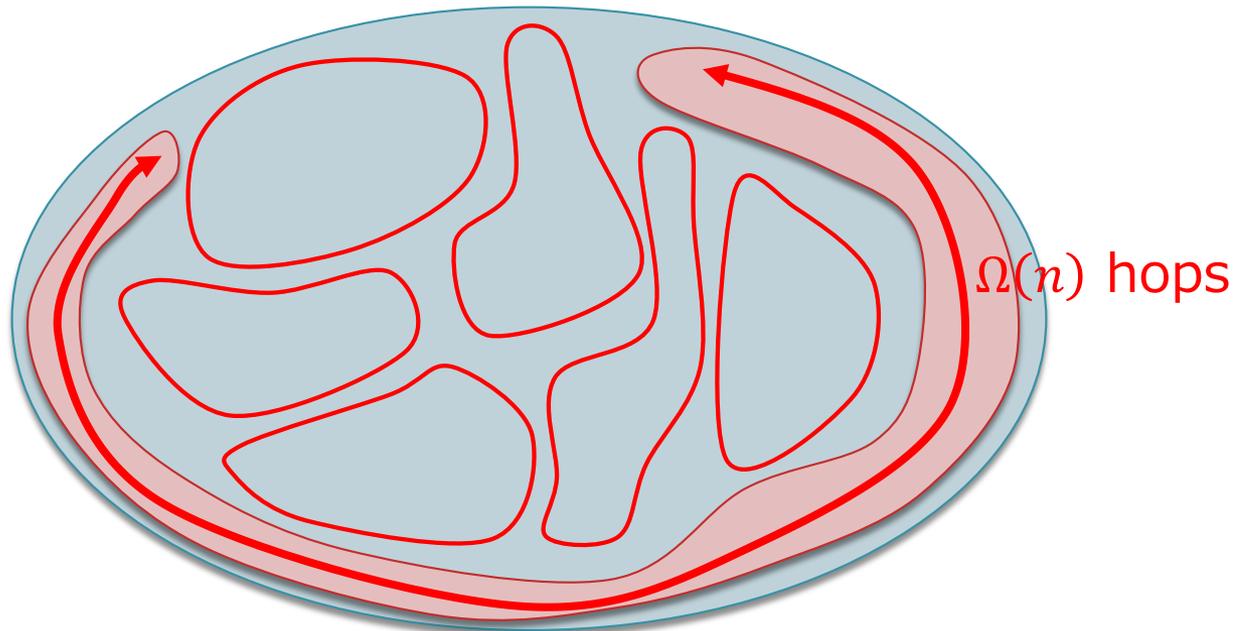
Naive in-fragment aggregation is slow !



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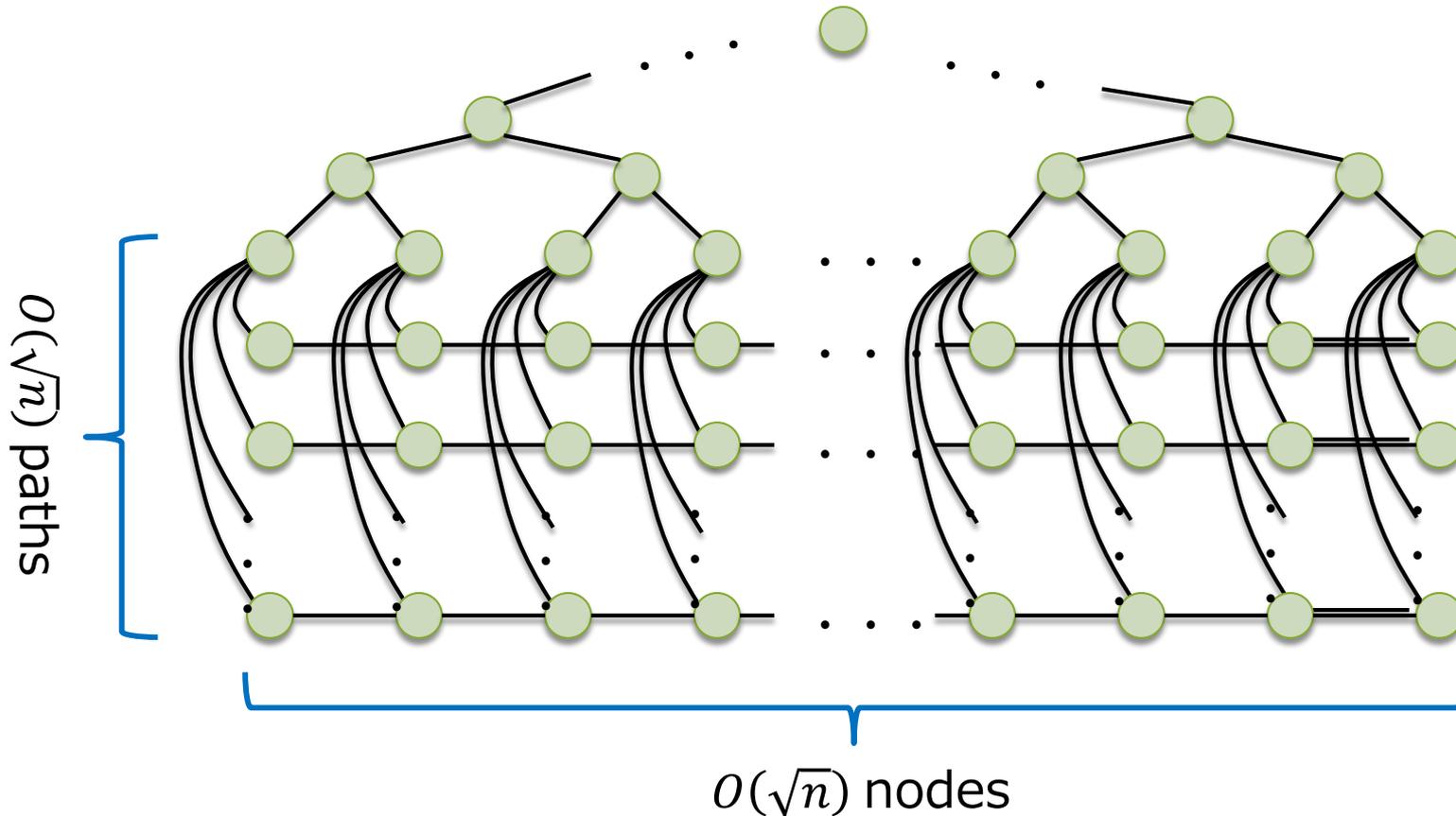
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# A Hard-Core Instance for MST

- ... and many other problems

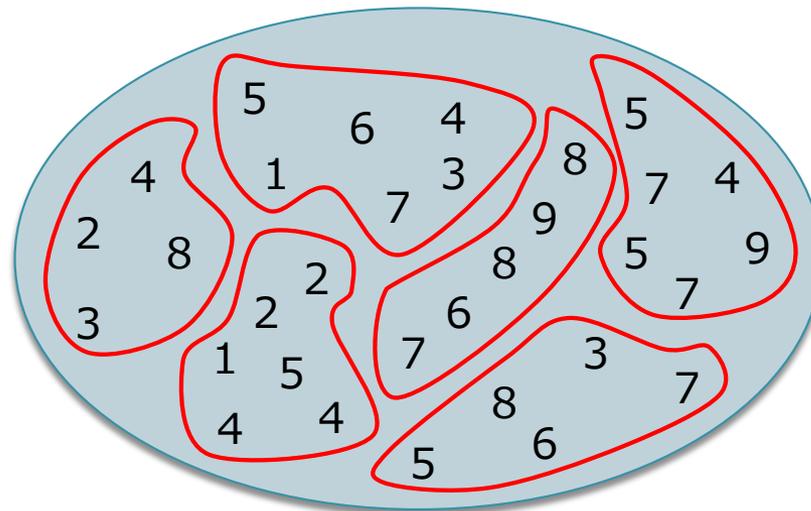


$\Omega(\sqrt{n} + D)$ -round lower bound !

# Partwise Aggregation(Minimum)

Definition :

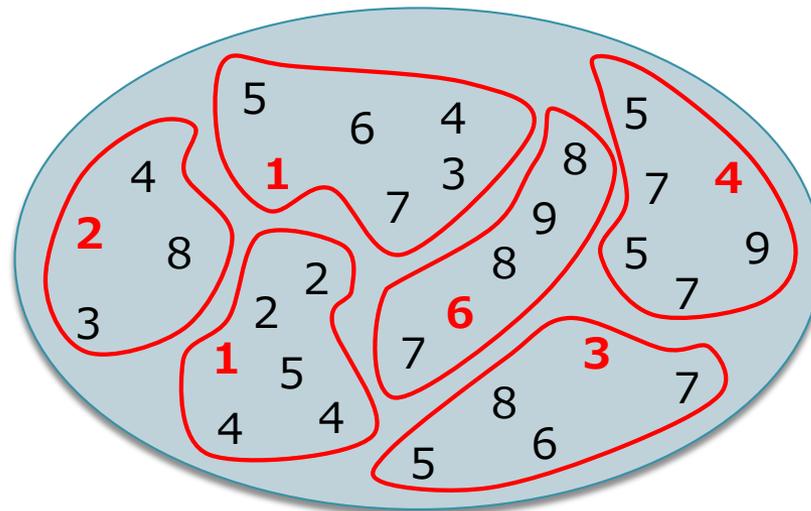
- Each node has one value ( $O(\log n)$  bits)
- Each link can transmit  $O(\log n)$  bits / round
- $V(G)$  is partitioned into a number of connected subgraphs  $P_1, P_2, \dots, P_N$
- For all  $P_i$  ( $1 \leq i \leq N$ ), find the minimum value in  $P_i$  independently



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# Motivation

- Partwise aggregation plays an important role for designing distributed algorithms in CONGEST model

(CONGEST model : Round-based synchrony +  $O(\log n)$ -bit bandwidth)

- Meta-Theorem [Folklore + Ghaffari and Haeupler' 16]

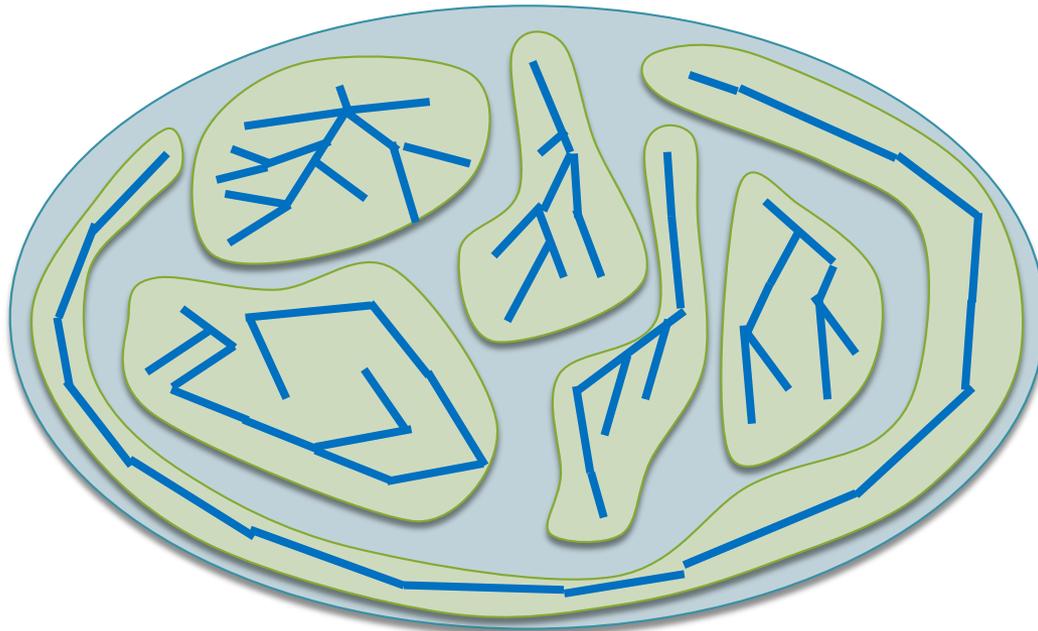
Efficient partwise aggregation



Efficient distributed algorithm for MST,  
min-cut, weighted shortest path, and so on...

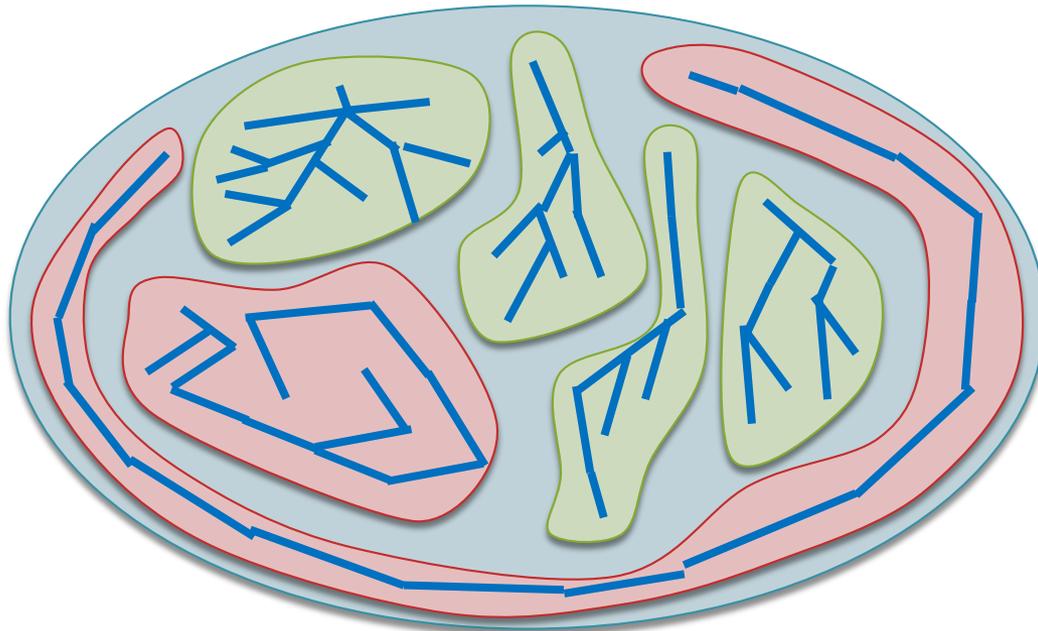
# Naive Solution(1)

- In-part aggregation
  - ▣ BFS trees in parts might have a large diameter
    - The diameter even becomes  $O(n)$ , so  $O(n)$  rounds



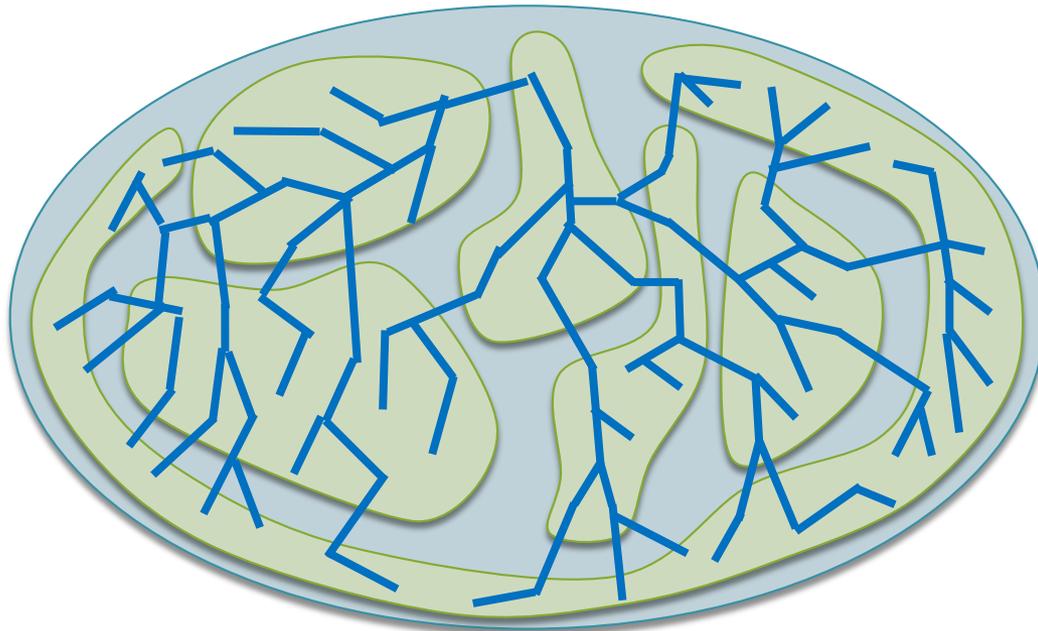
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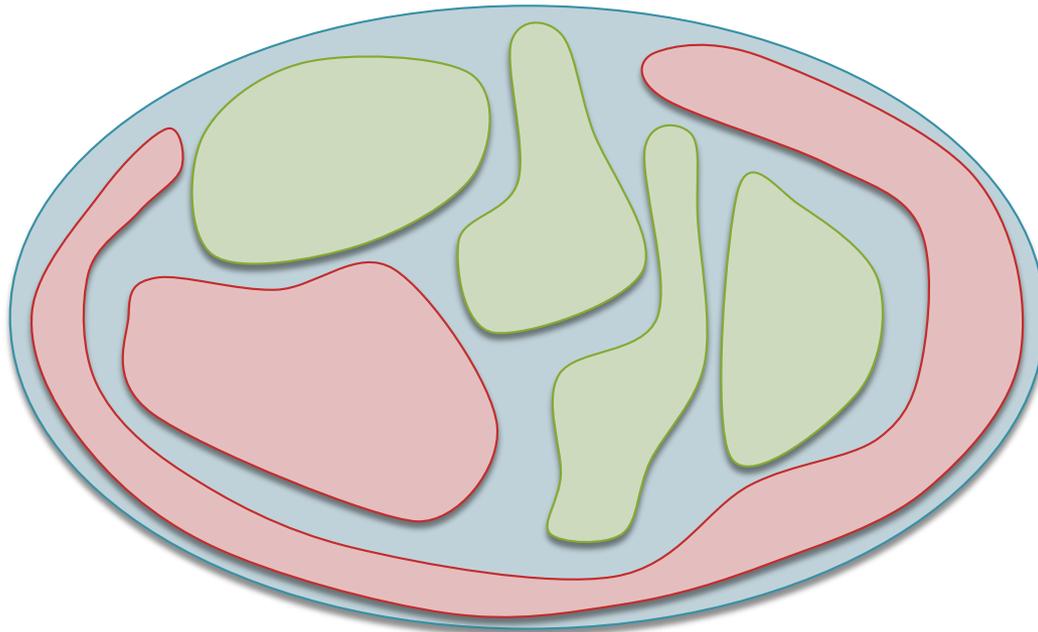
# Naive Solution(2)

- Aggregation via a global BFS tree
  - ▣ Pipelined scheduling achieves  $O(D + N)$  rounds
    - $N$  can become  $O(n)$ , so  $O(n)$  rounds



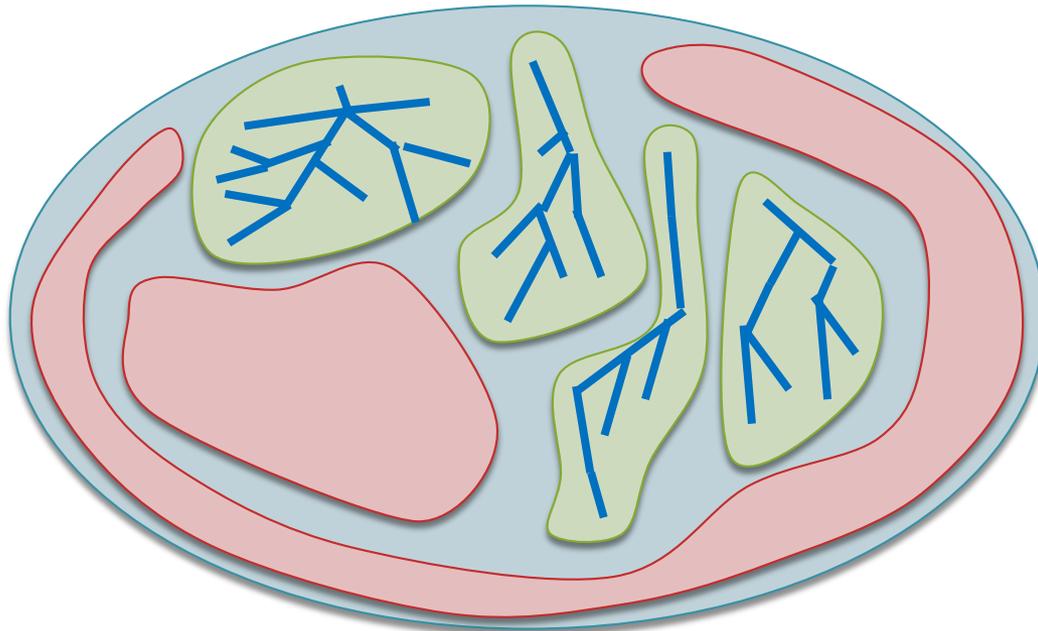
# The Optimal Solution

- $|V(P_i)| \leq \sqrt{n}$  : Naive in-part aggregation
- $|V(P_i)| > \sqrt{n}$  : Use a BFS tree of the whole network + pipelined scheduling



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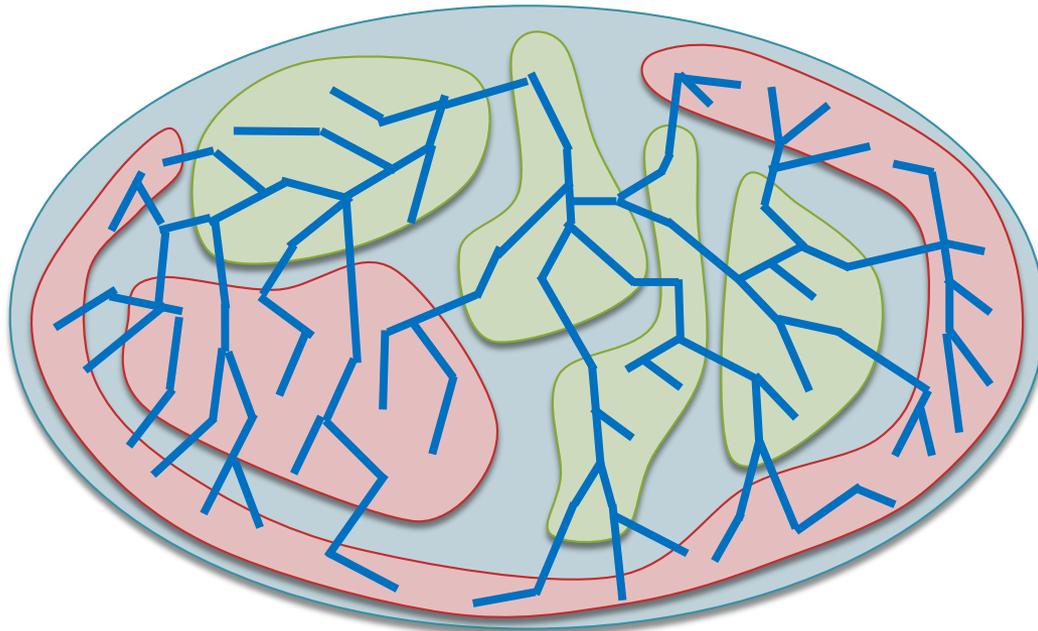
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$\tilde{O}(\sqrt{n} + D)$ -round solution



# Good Algorithms for Good Graphs

- This is an existential lower bound
  - ▣ There exists “an instance” exhibiting expensive cost
- We can expect much faster aggregation for many “not-so-bad” instances
  - ▣ Universal Lower bound :  $\Omega(D)$  rounds

## Problem

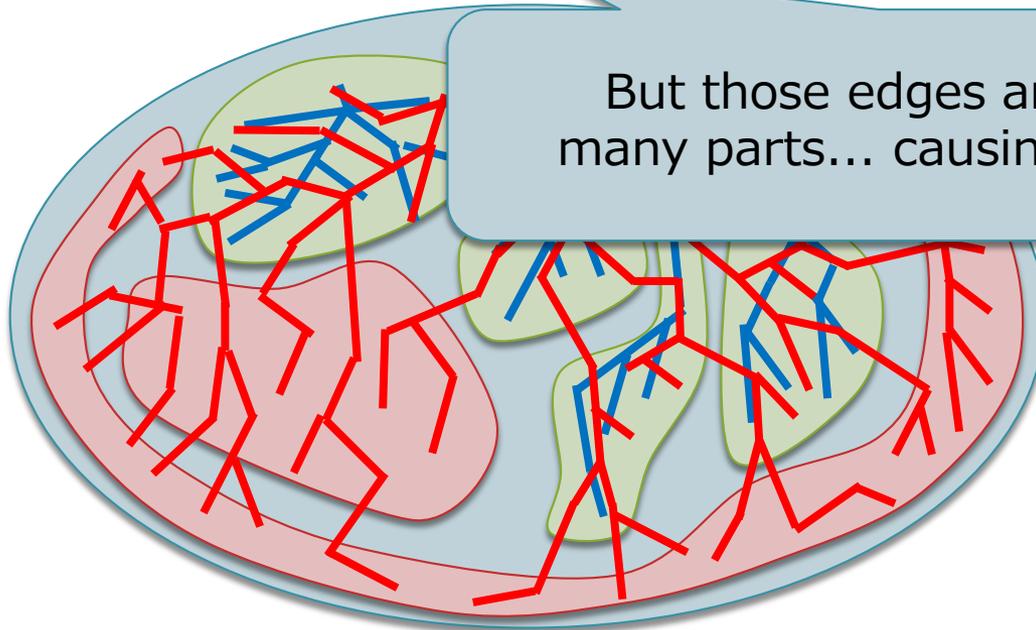
What graphs (classes) allow faster aggregation?

# Shortcuts - An alternative view of P.A.

- $|V(P_i)| \leq \sqrt{n}$  : Naive in-part aggregation
- $|V(P_i)| > \sqrt{n}$  : Use a BFS tree of the whole network + pipelined scheduling

Augmenting the edges outside of the part for faster aggregation

But those edges are shared by many parts... causing congestion !



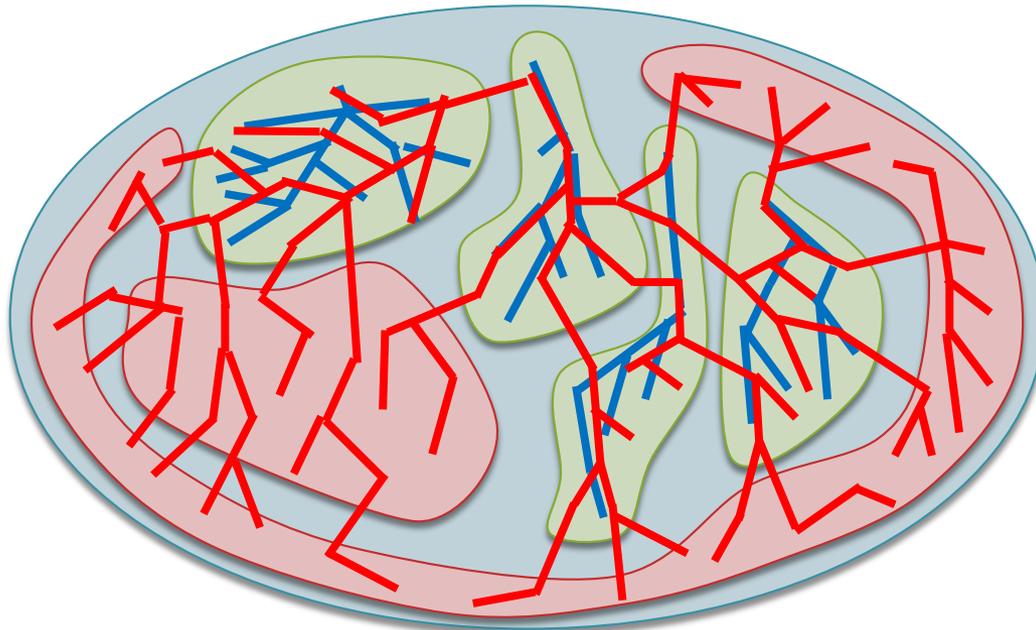
# (d,c)-shortcut

- Given a connected partition  $P_1, P_2, \dots, P_N$  of  $G$
- **(d,c)-shortcut** is a subgraph  $H_1, H_2, \dots, H_N$  s.t.
  - ▣ For any  $i$ ,  $P_i + H_i$  has diameter at most  $d$  (dilation)
  - ▣ Each edge  $e \in E(G)$  is used as a shortcut edge at most  $c$  times
- An algorithm constructing (d,c)-shortcut for any partition with  $O(f)$  rounds induces  $\tilde{O}(d + c + f)$ -round algorithms for partwise aggregation !
  - ➡ For measuring quality,  $\max\{d, c\}$  is usually enough.  
We state simply by  $k$ -shortcuts if  $k = \max\{d, c\}$

# Shortcuts - An alternative view of P.A.

- $|V(P_i)| \leq \sqrt{n}$  : Naive in-part aggregation      dilation :  $\sqrt{n}$
- $|V(P_i)| > \sqrt{n}$  : Use a BFS tree of the whole network  
+ pipelined scheduling      congestion :  $\sqrt{n}+1$

$O(\sqrt{n})$ -shortcut



# Shortcut and Graph Classes : Known Results

Graph Family	Quality	Construction	Lower Bound
Genus- $g$ [GH16, HIZ16]	$O(\sqrt{g}D \log D)$	$O(\sqrt{g}D \log D)$	$\Omega\left(\frac{\sqrt{g}D}{\log g}\right)$
Treewidth- $k$ [HIZ16]	$O(kD \log n)$	$O(kD \log n)$	$\Omega(kD)$
Minor-Free [HLZ18]	$\tilde{O}(D^2)$	$\tilde{O}(D^2)$	$\Omega(D)$ (trivial)
Mixing Time $\tau$ [GKS17]	$O(\tau 2^{\sqrt{\log n \log \log n}} D)$	$O(\tau 2^{\sqrt{\log n \log \log n}} D)$	$\Omega(D)$ (trivial)
$k$ -chordal [KKIO19, in prep.]	$O(kD)$	$O(1)$	$\Omega(kD)$
Douling Dimension- $\alpha$ [KKIO19, in prep.]	$O(D^\alpha)$	$O(1)$	$\Omega(D^\alpha)$
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Spanning Tree-based approach

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Random-Walk based approach

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1-hop extension approach

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Lower Bound



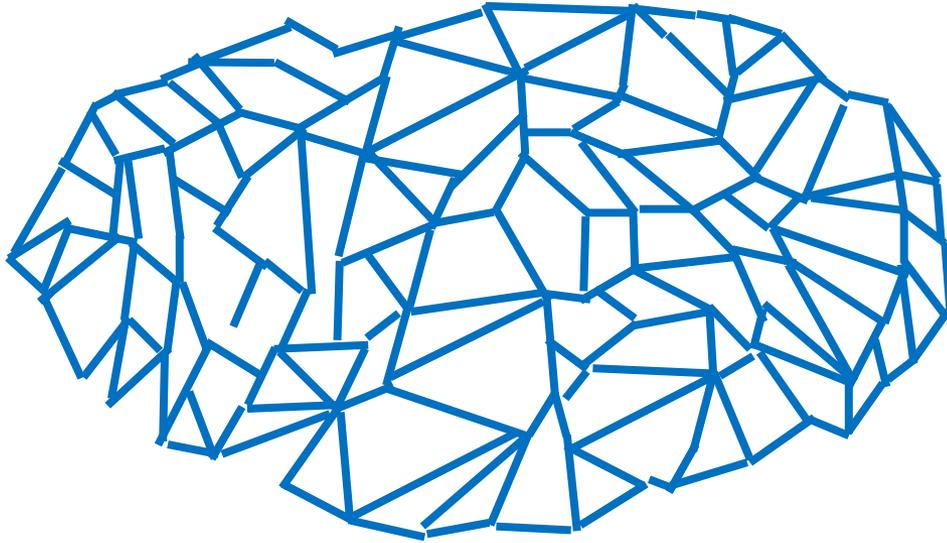
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1-hop extension +  $\alpha$  →

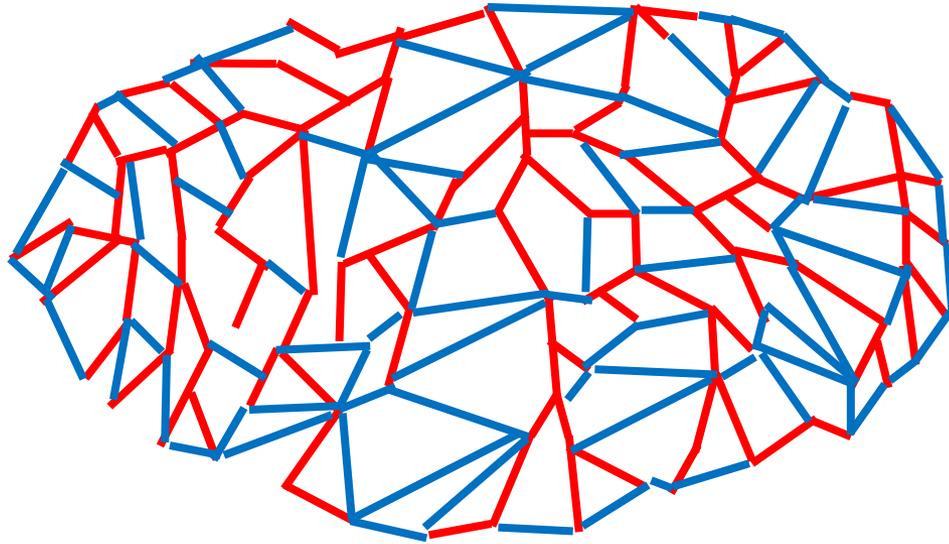
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1. Construct a spanning tree



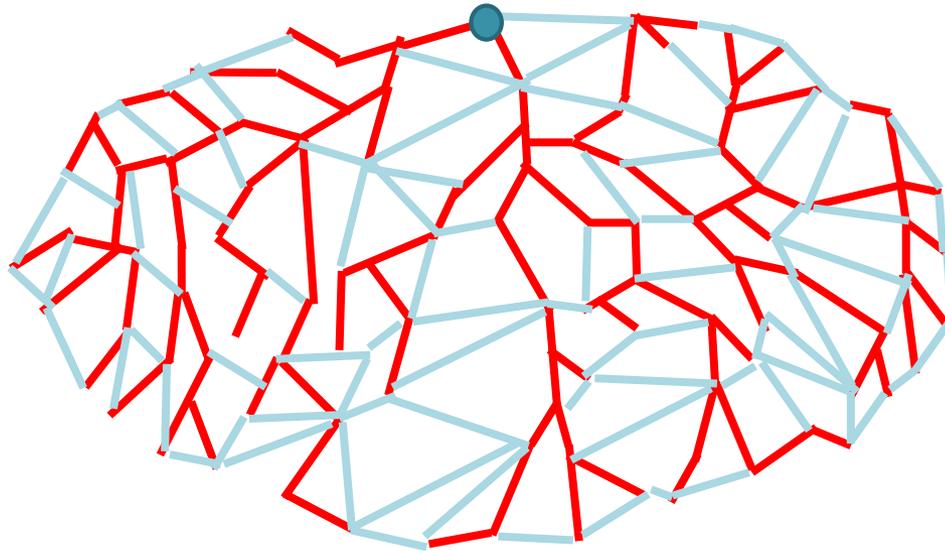
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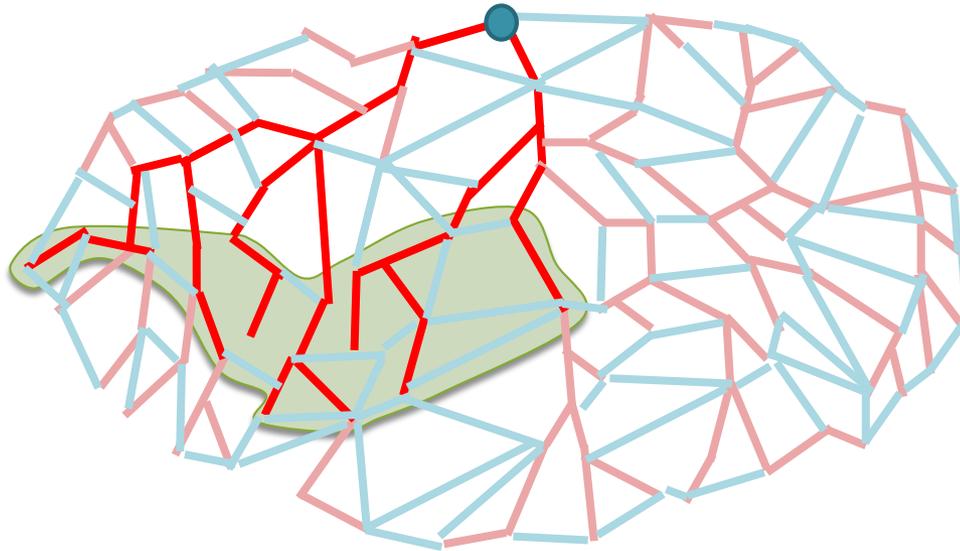
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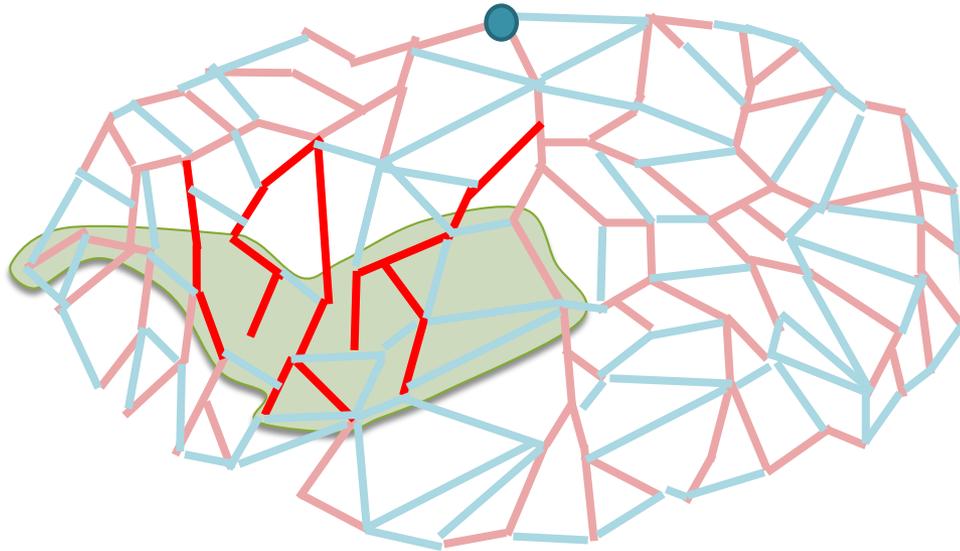
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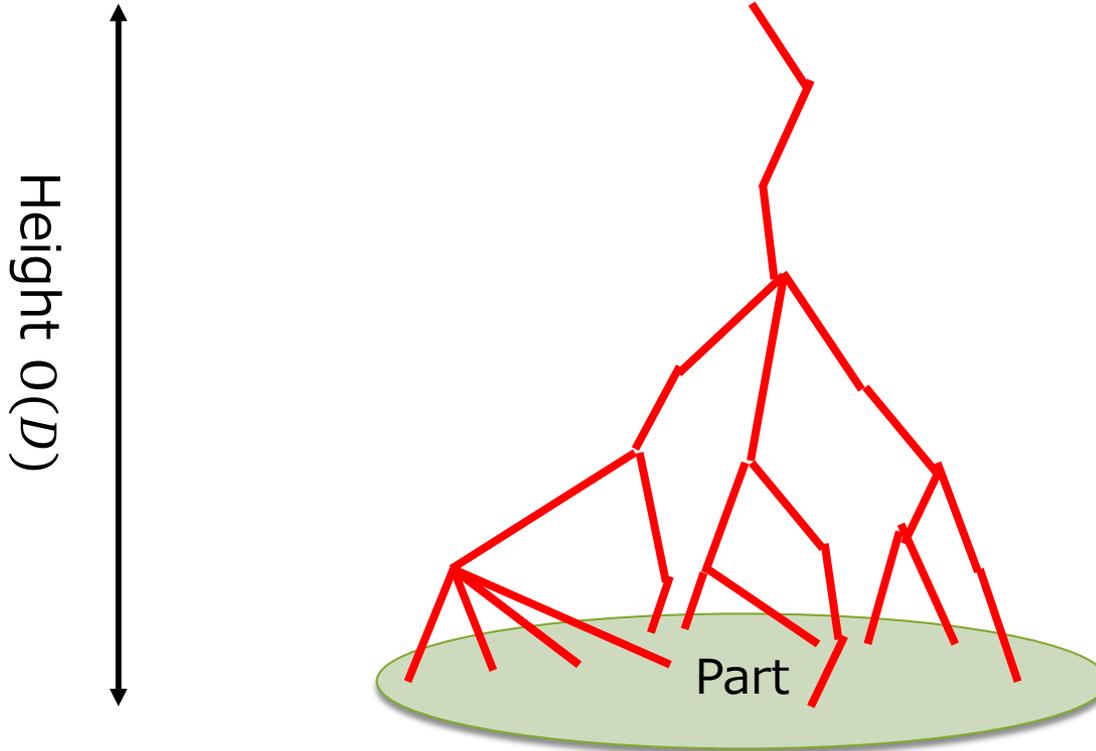
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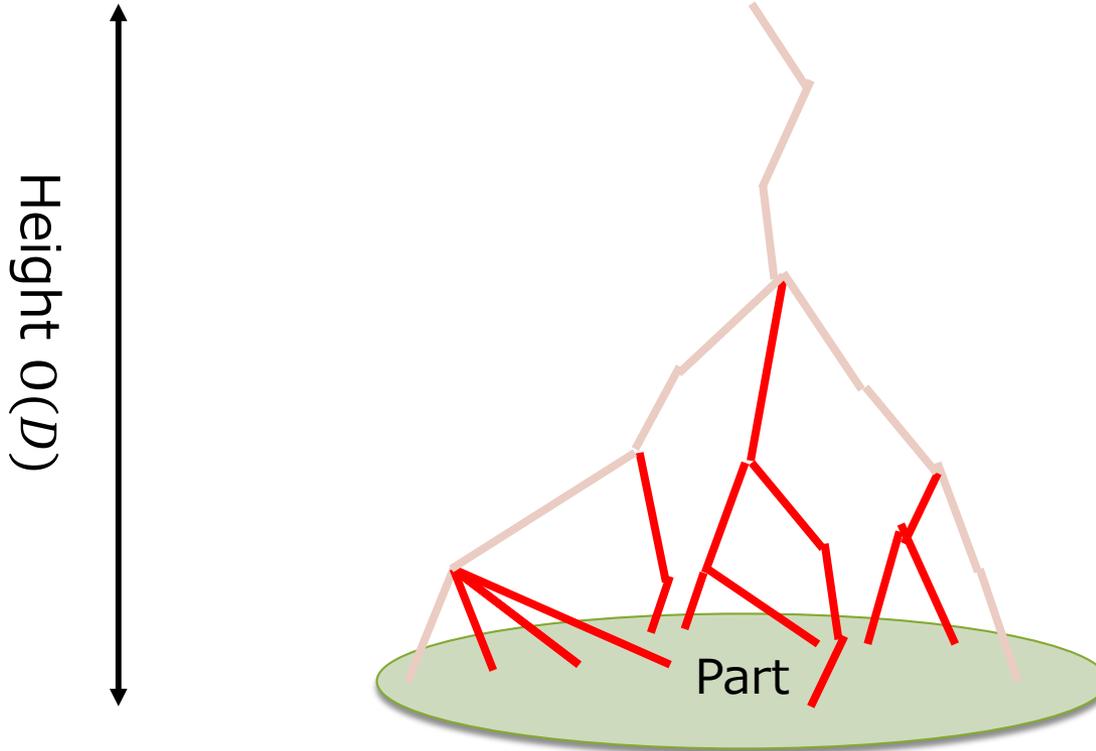
# Proving the Quality

- Taking a BFS tree, this construction achieves
  - ▣  $O(D^2)$  dilation
  - ▣  $O(D)$  congestion



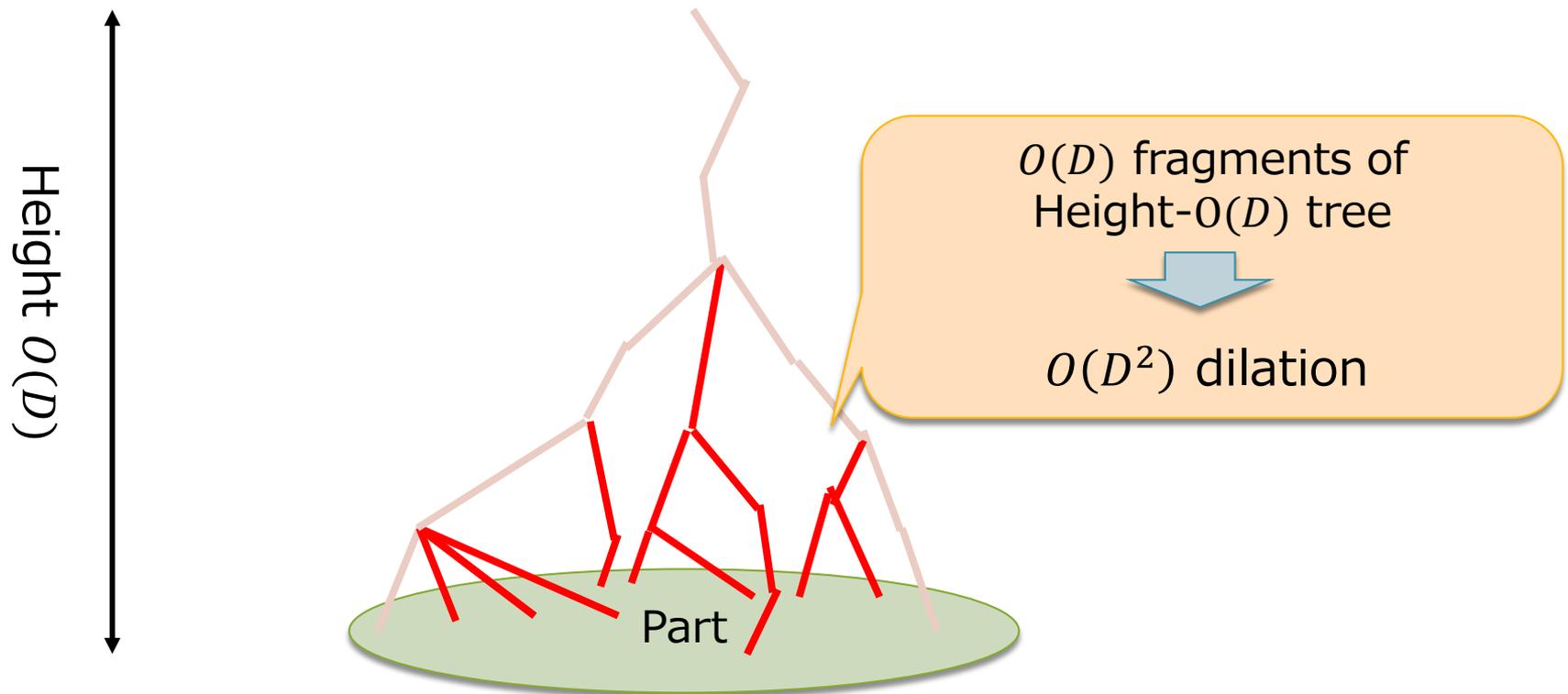
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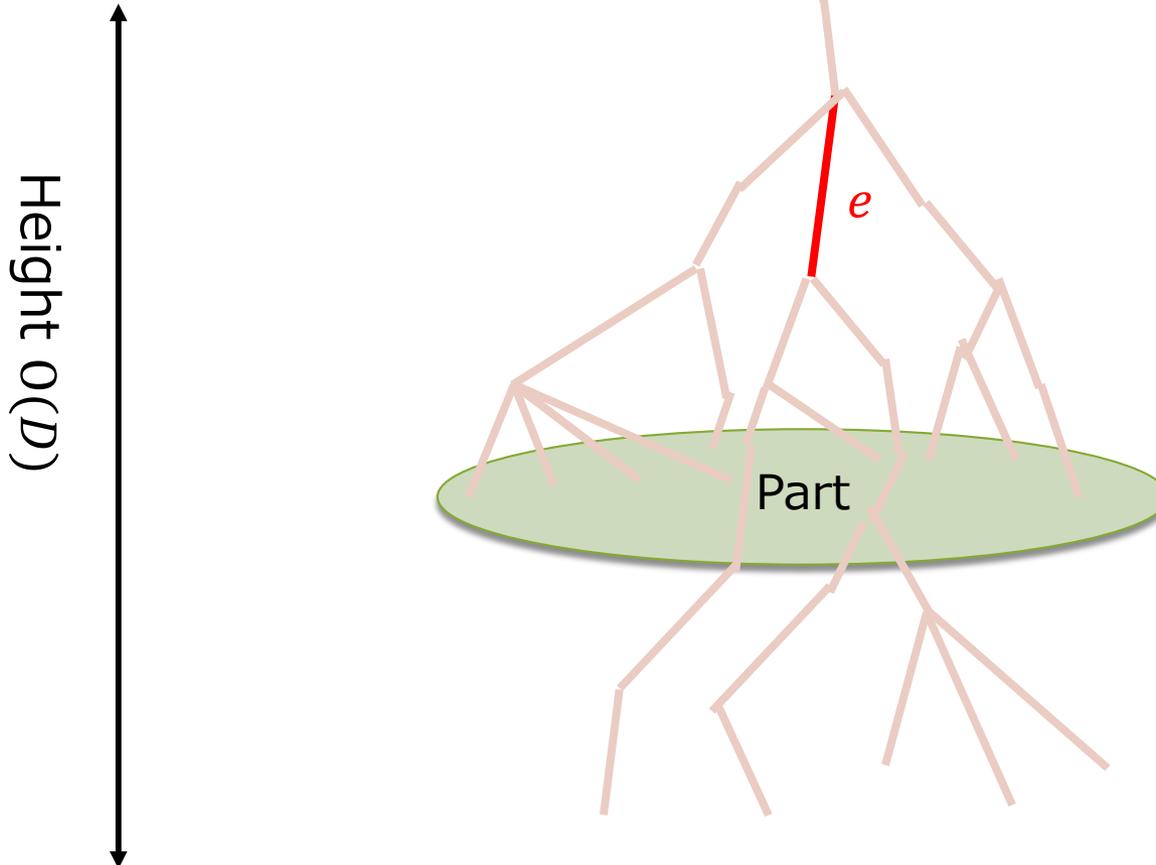
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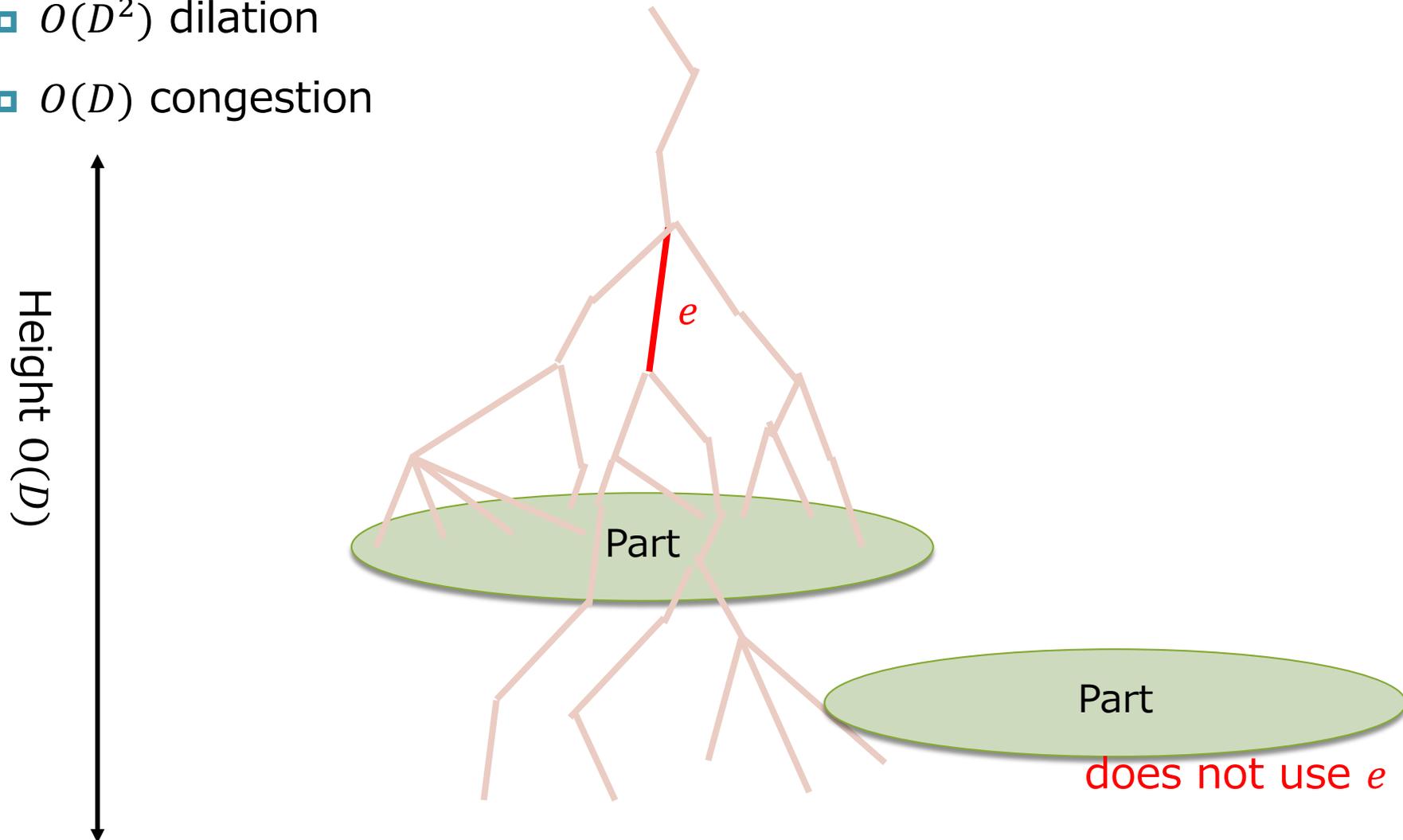
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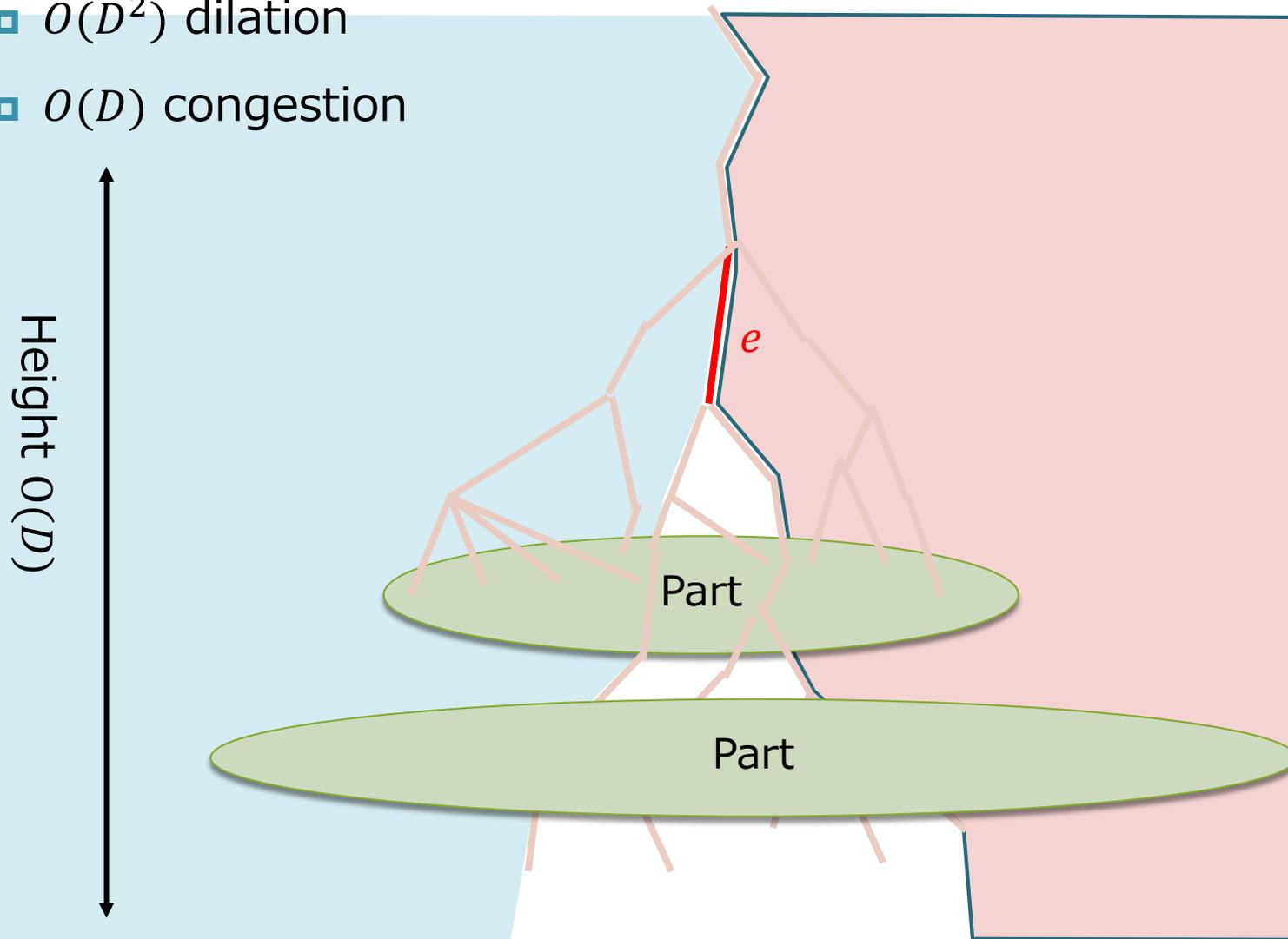
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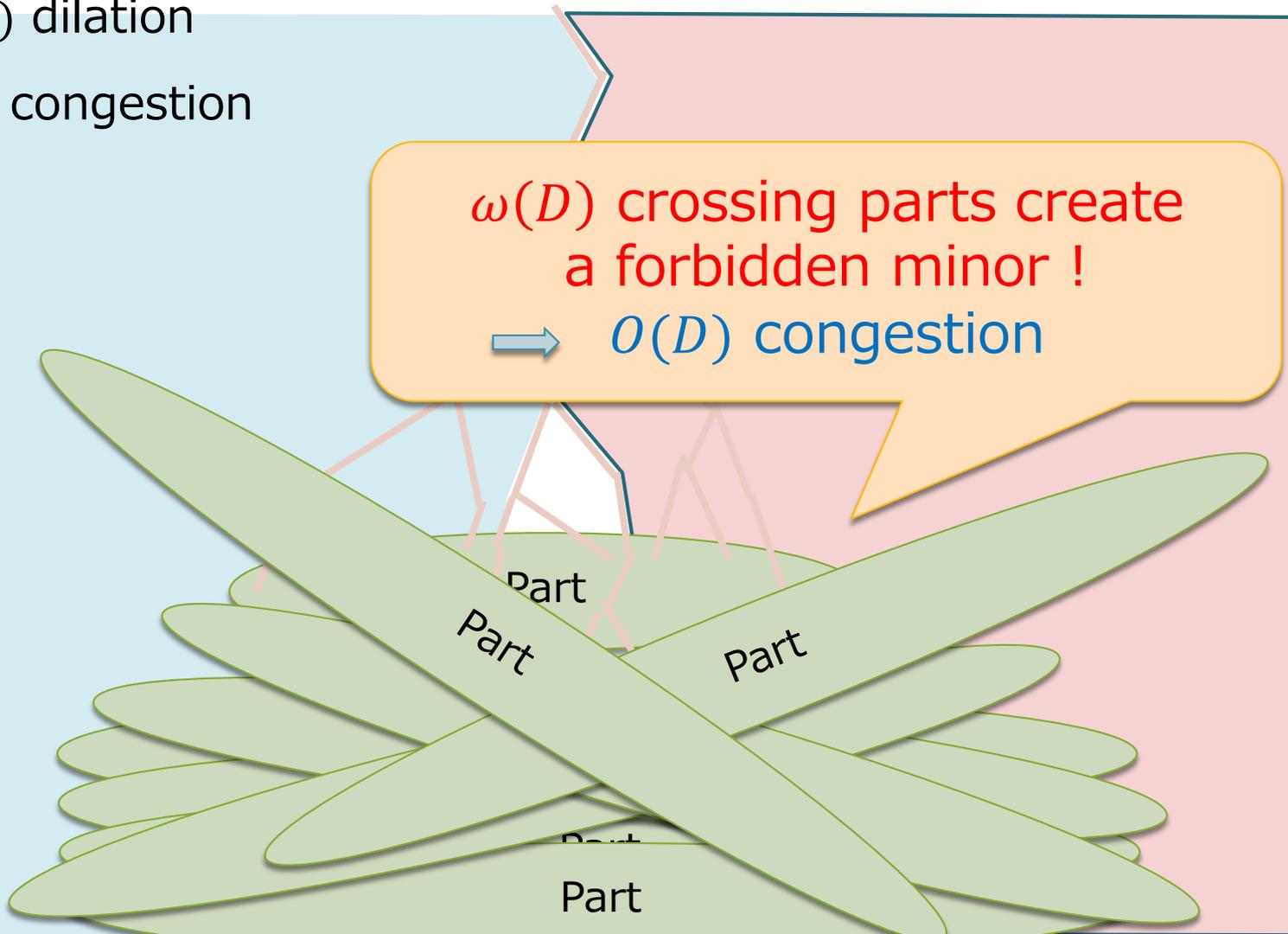
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# Proving the Quality

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Height  $O(D)$

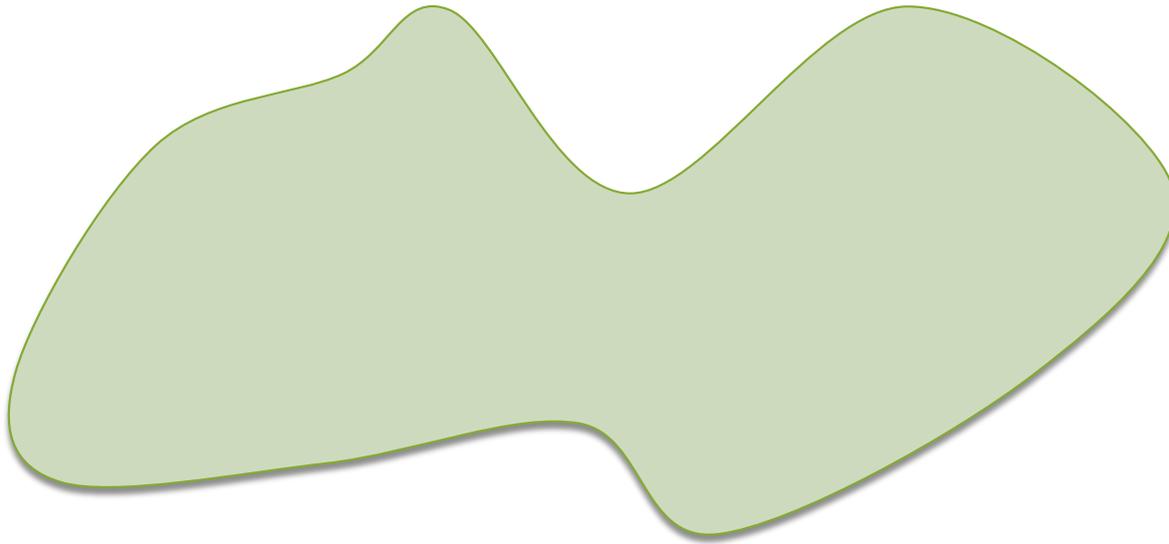


# Distributed Construction

- The construction requires a planar embedding
  - ▣ It is possible (in distributed manner)  
[Ghaffari and Haeupler, PODC'16]
- There also exists an algorithm without embedding  
[Haeupler, I, Zuzic, '16]
  - ▣ A versatile algorithm (not only for planar graphs)
  - ▣ Find **any spanning-tree based shortcuts (efficiently)**  
→ Only existential proofs suffice!

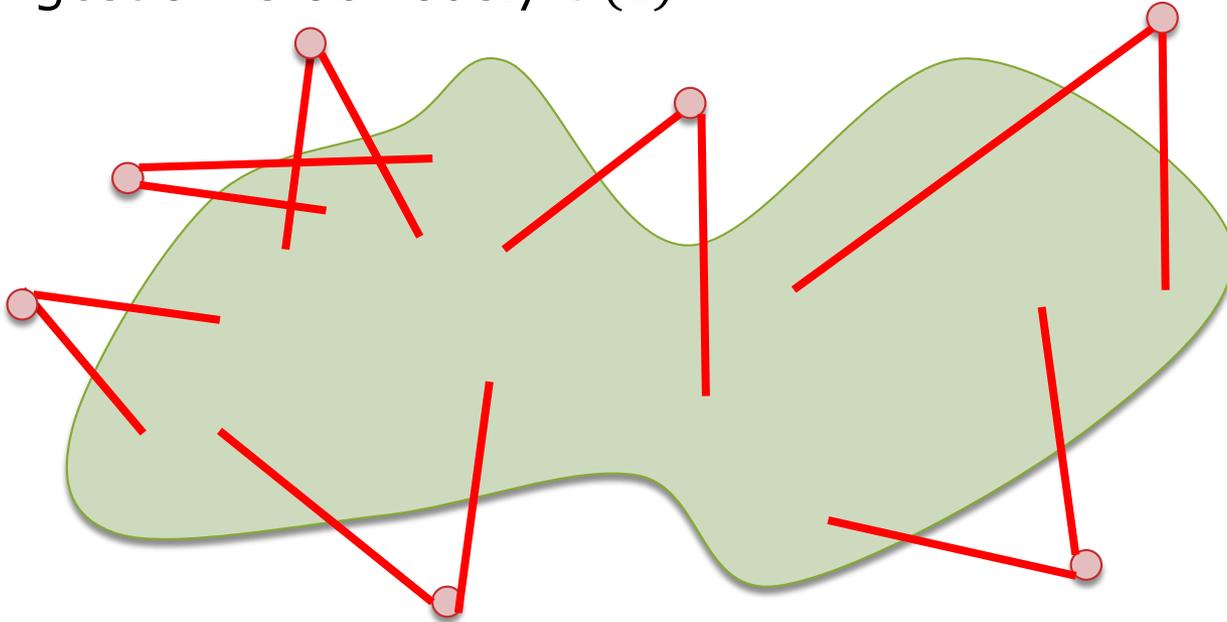
# 1-hop Extension Approach

- Take all the edges touching each part



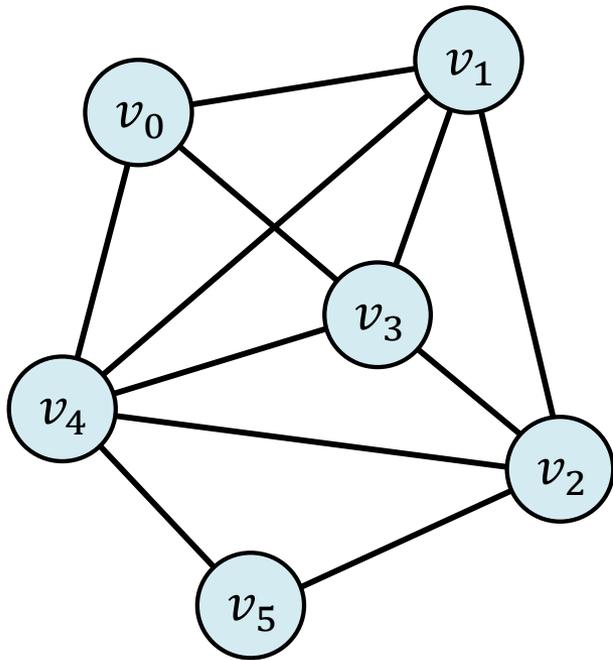
# 1-hop Extension Approach

- Take all the edges touching each part
  - ▣ Congestion is obviously  $O(1)$

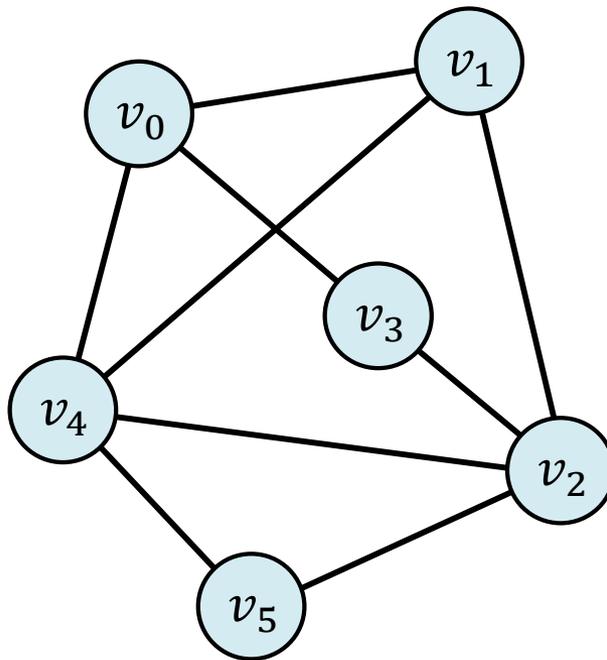


# Application : $k$ -chordal graphs

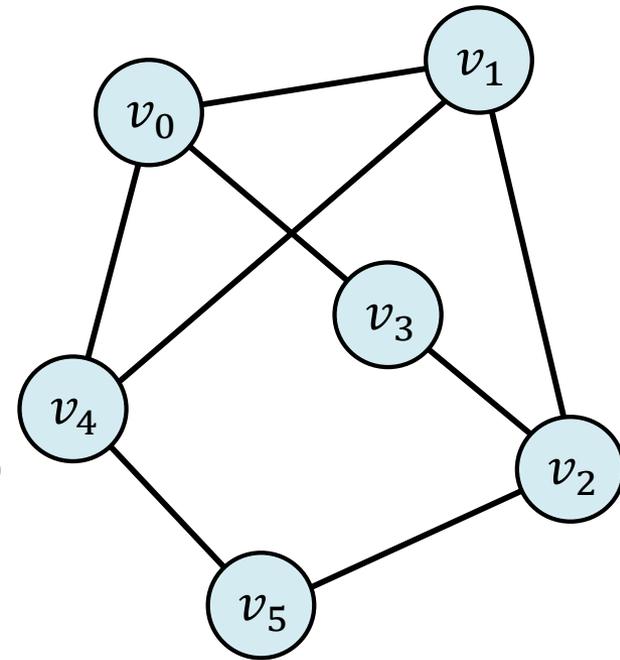
- $k$ -chordal graphs = any induced cycle has length at most  $k$



3-chordal  
(chordal)



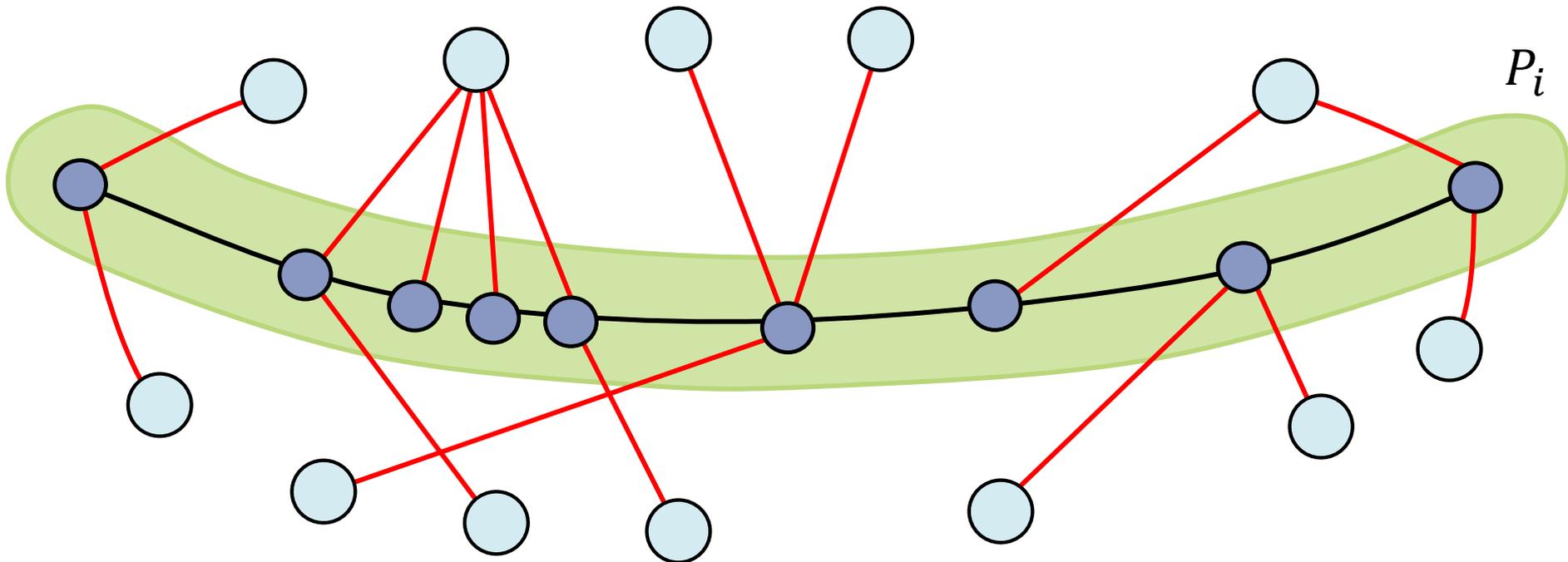
4-chordal



5-chordal

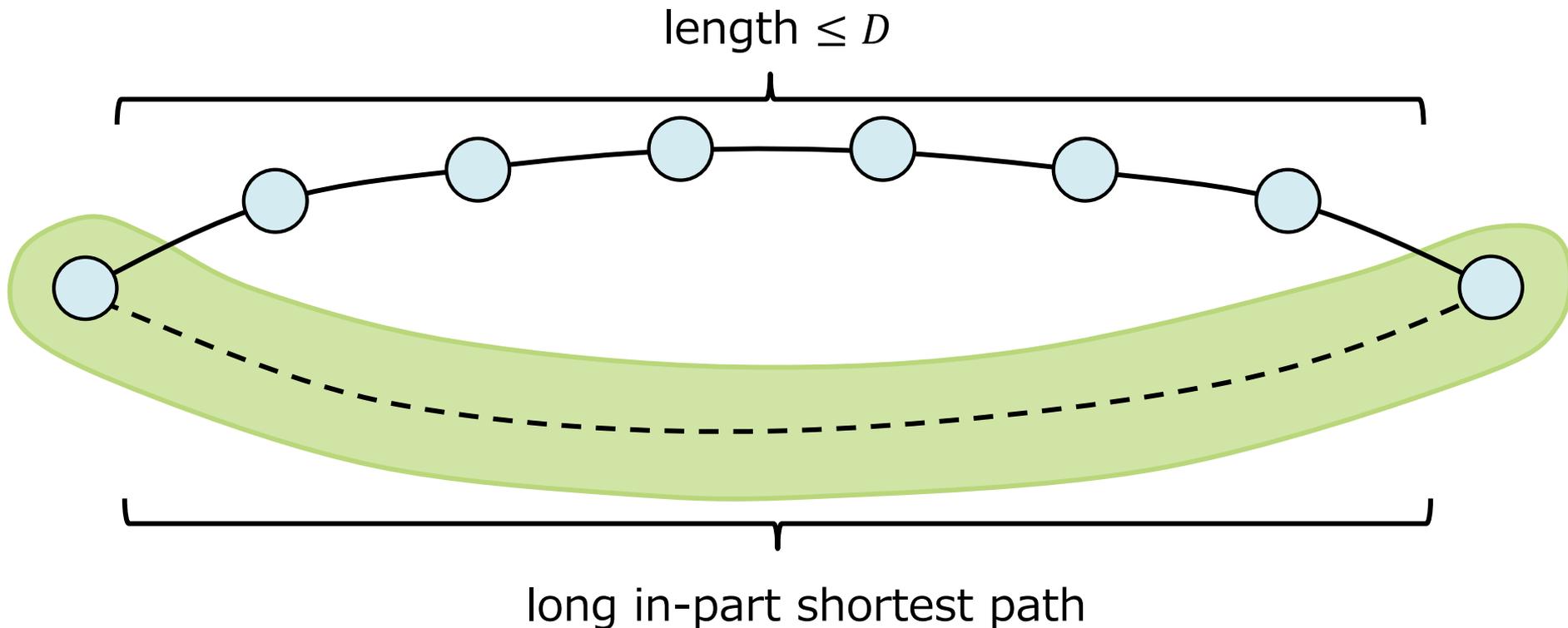
# 1-hop extension for $k$ -chordal graphs

- 1-hop extension shrinks the diameter of any subgraph of  $k$ -chordal graphs!



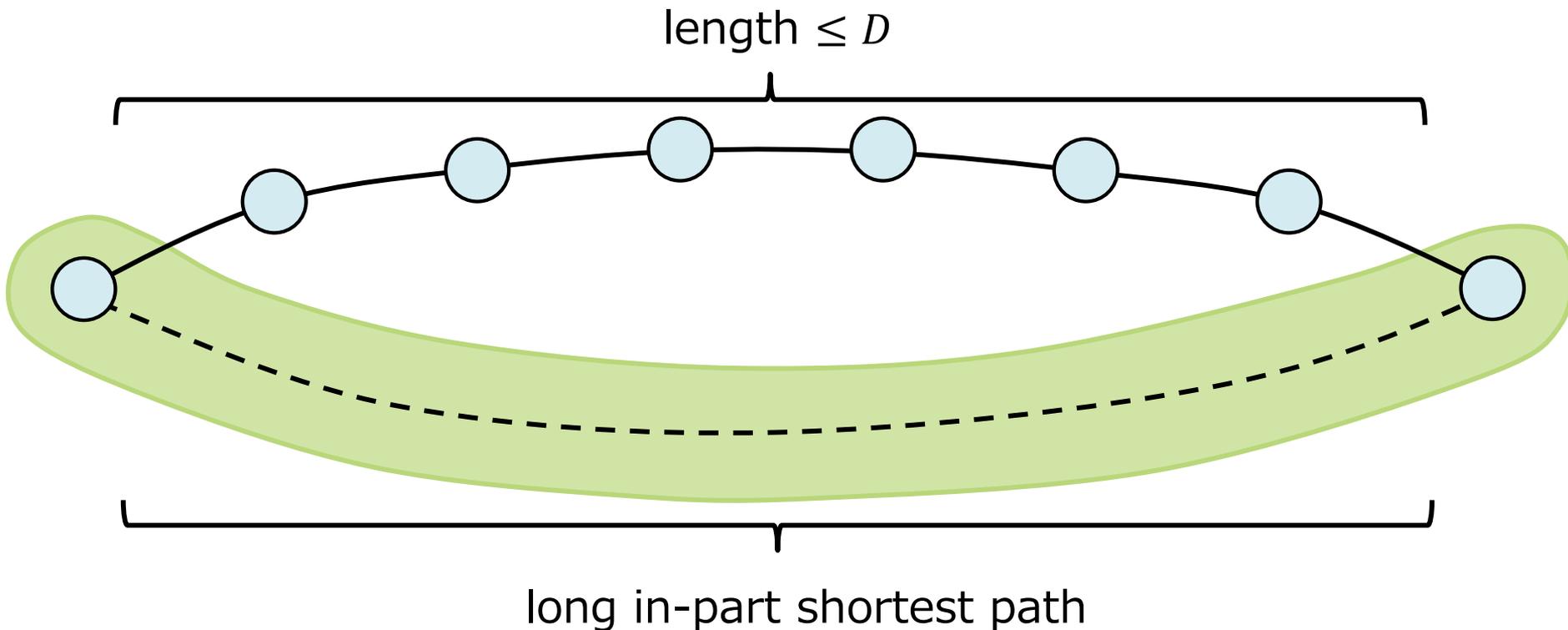
# 1-hop extension for $k$ -chordal graphs

- Take two nodes far apart in the part
    - ▣ Shortest path in the part is long
  - They have a (shortest) path  $\leq$  diameter  $D$
- } Assume their disjointness for simplicity



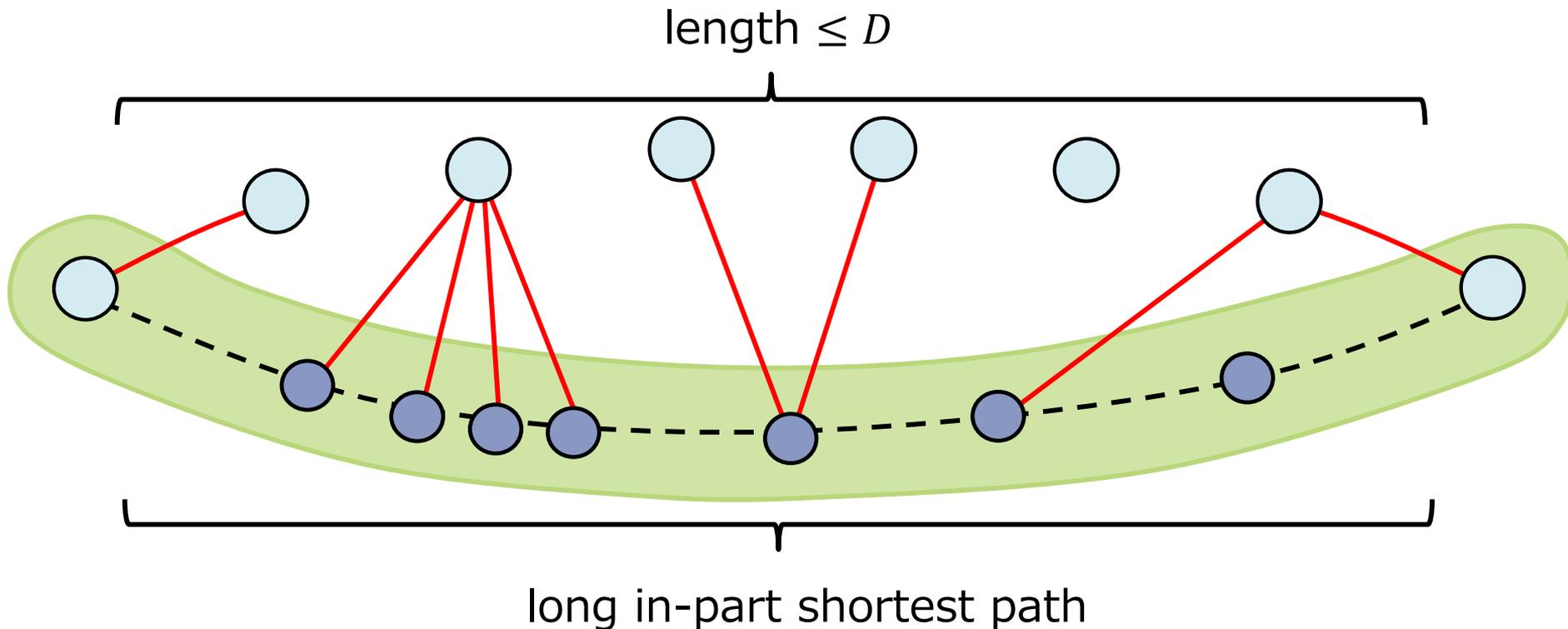
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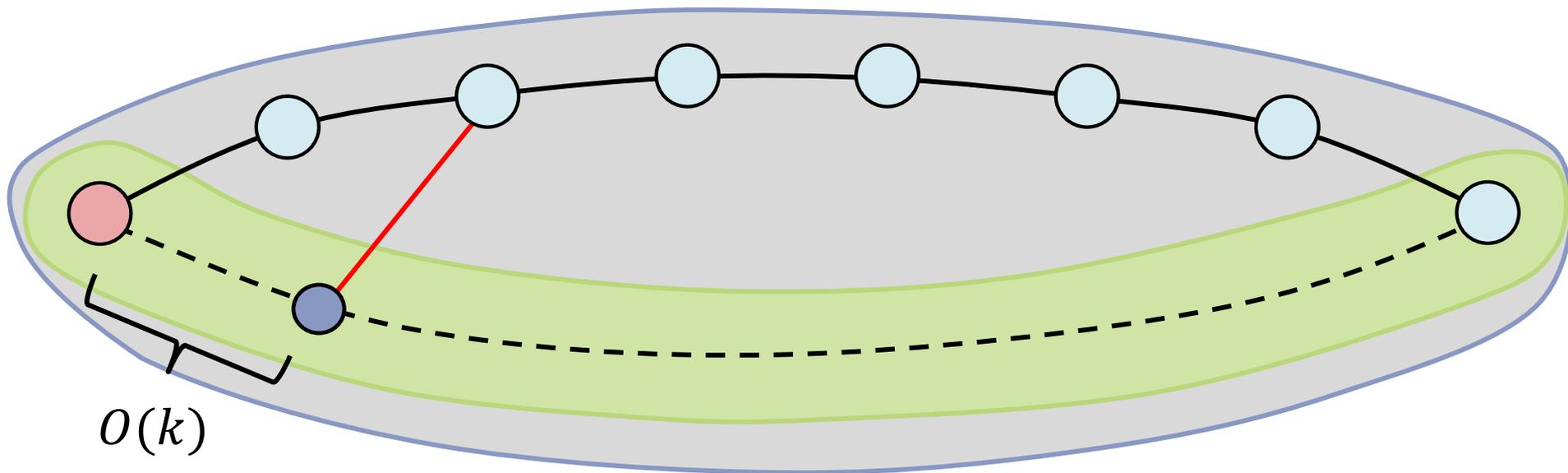
# 1-hop extension for $k$ -chordal graphs

- What happens taking 1-hop extension edges



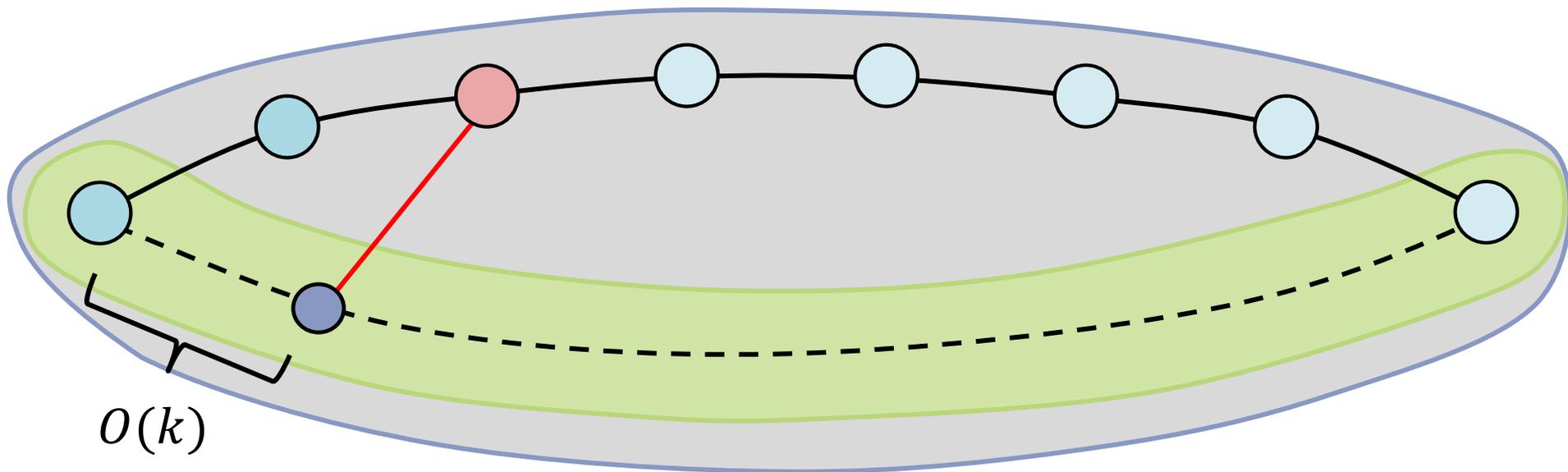
# 1-hop extension for $k$ -chordal graphs

- Exploration from the left
  - ▣ Can find one shortcut edge within distance  $O(k)$  because of  $k$ -chordality



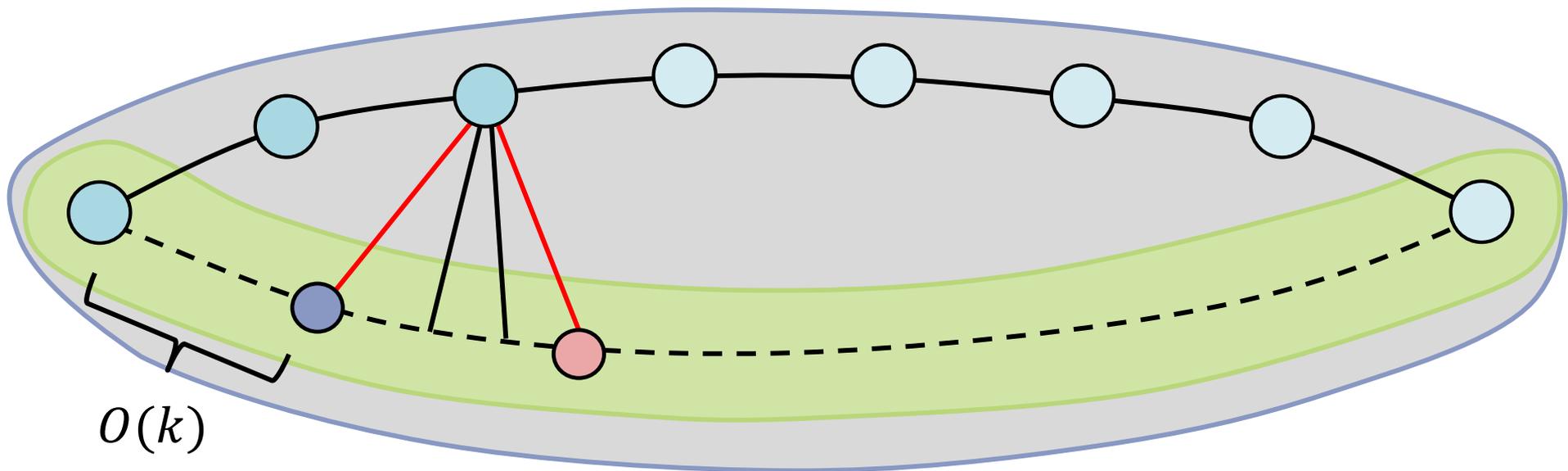
# 1-hop extension for $k$ -chordal graphs

- Exploration from the left
  - ▣ Can find one shortcut edge within distance  $O(k)$  because of  $k$ -chordality



# 1-hop extension for $k$ -chordal graphs

- Go back to the part (by taking the best edge)

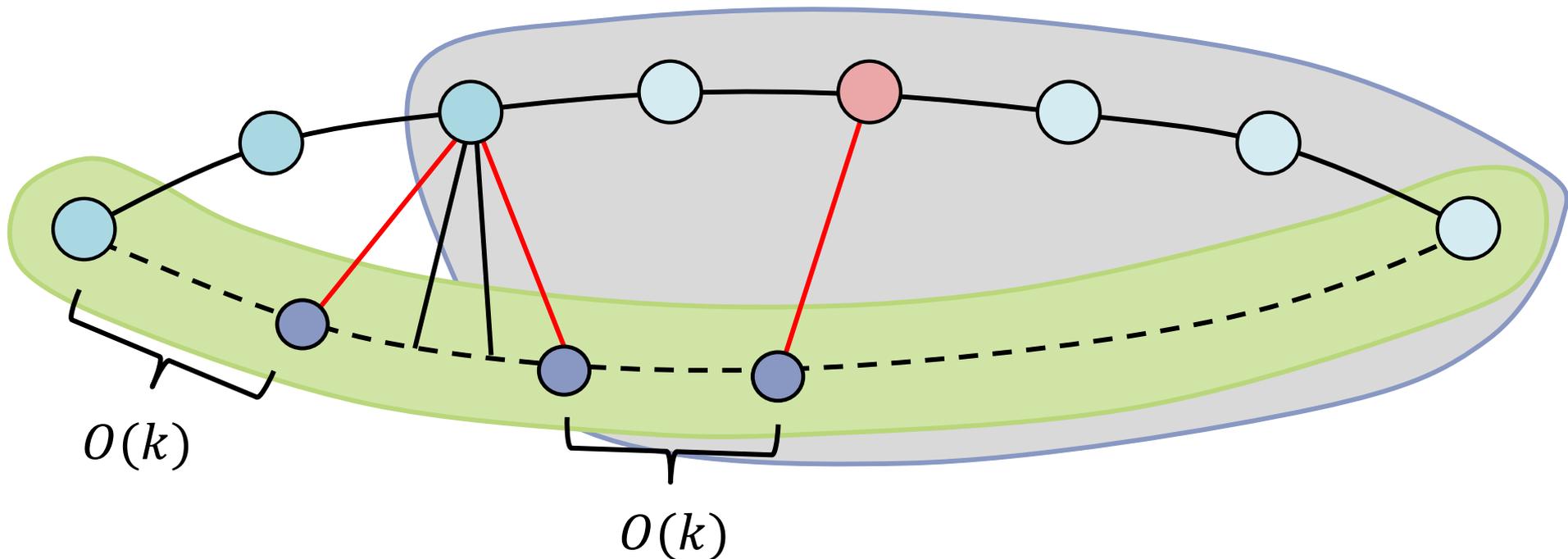






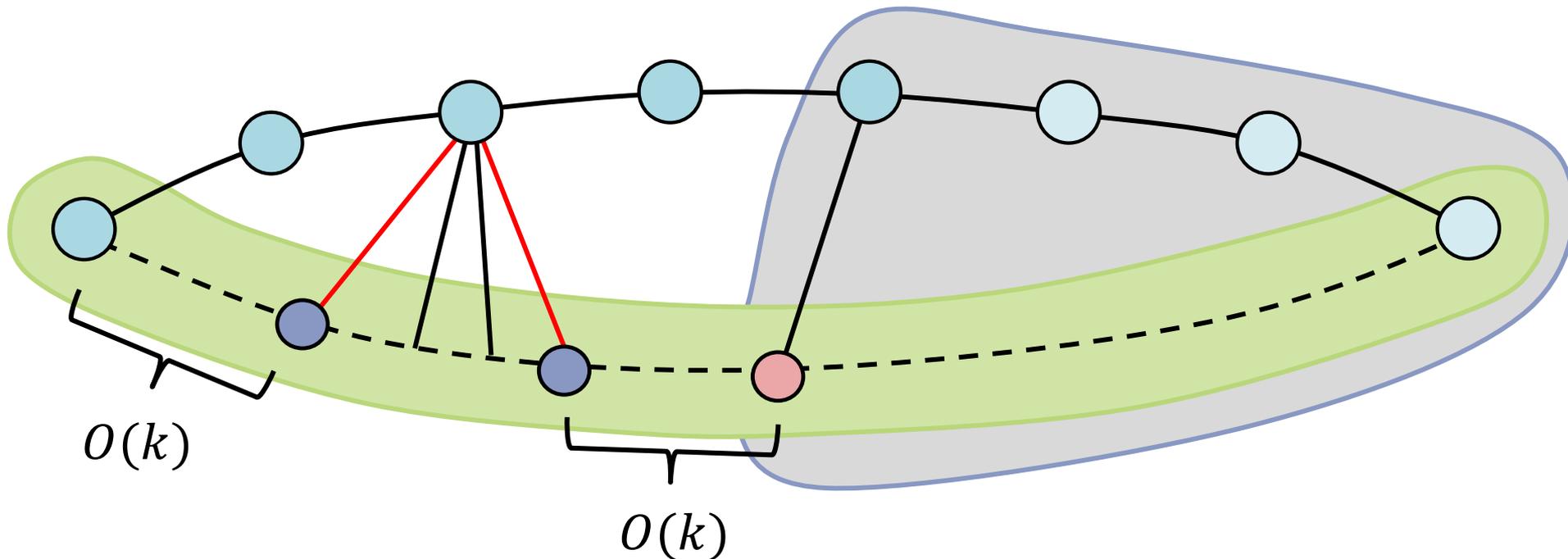
# 1-hop extension for $k$ -chordal graphs

- Do the same thing for the remaining cycle



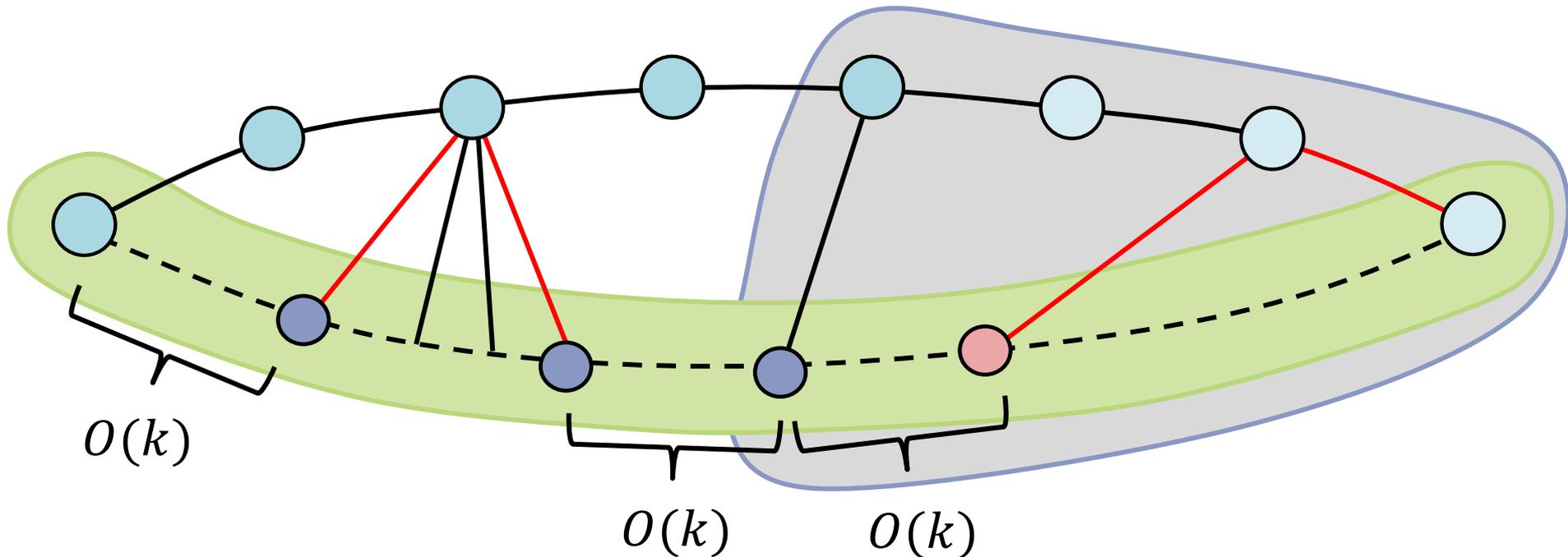
# 1-hop extension for $k$ -chordal graphs

- Do the same thing for the remaining cycle



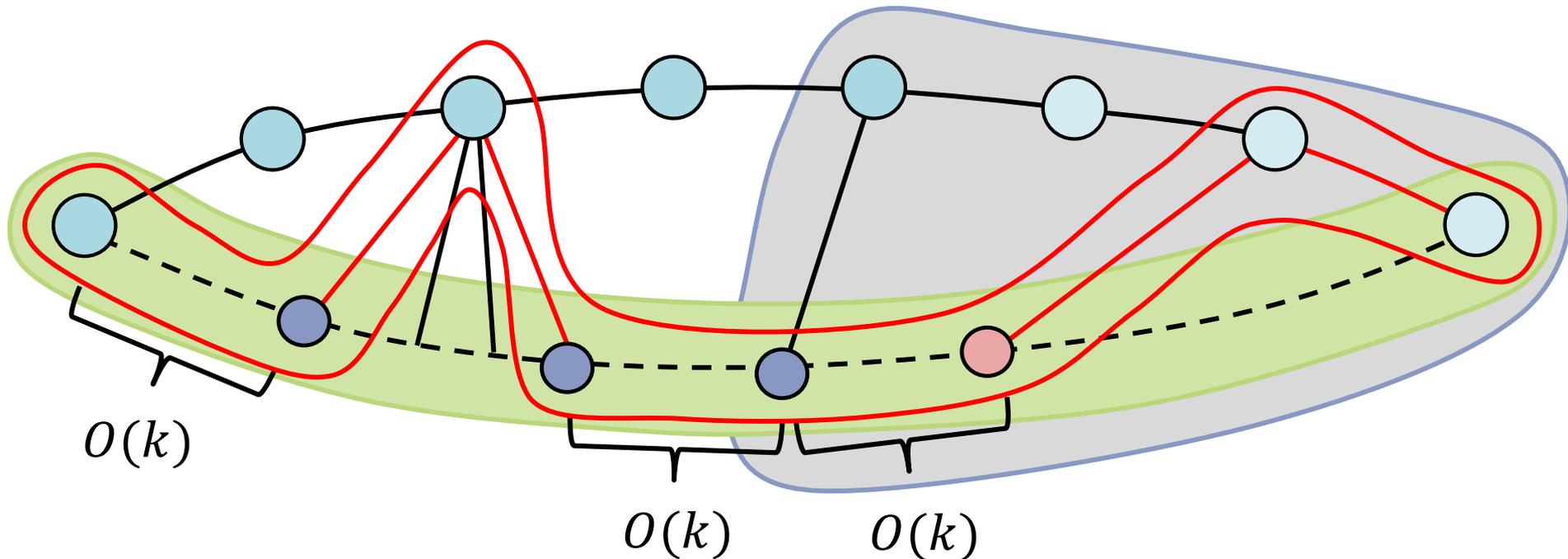
# 1-hop extension for $k$ -chordal graphs

- Do the same thing for the remaining cycle



# 1-hop extension for $k$ -chordal graphs

- The shortest path length using 1-hop extension edges is  $O(kD)$



# Open Problems

- On graph classes
  - ▣ Optimal shortcuts for minor-closed family (generalization of bounded genus/treewidth graphs)
  - ▣ Everywhere sparse graphs (further generalization ?)
  - ▣ Highly-connected graphs
- Versatile algorithms
  - ▣ Automatic transformer from existential results to constructability results

# Open Problems

- How about other problems?

Theorem [GH16]]

$\tilde{O}(f)$ -round PA  $\rightarrow$   $\tilde{O}(f)$ -round MST

Theorem[GH16]

$\tilde{O}(f)$ -round PA  $\rightarrow$   $\tilde{O}(f)$ -round  $(1 + \epsilon)$ -approx. min-cut

Theorem[HL18]

$\tilde{O}(f)$ -round PA  $\rightarrow$  For  $\beta = (\log n)^{\Omega(1)}$ ,

$\tilde{O}(\beta f)$ -round  $O(n^{\frac{\log \log n}{\log \beta}})$ -approx. SSSP

- Known that it does not help the diameter or APSP