

# Multiway Simple Cycle Separators and I/O-Efficient Algorithms for Planar Graphs

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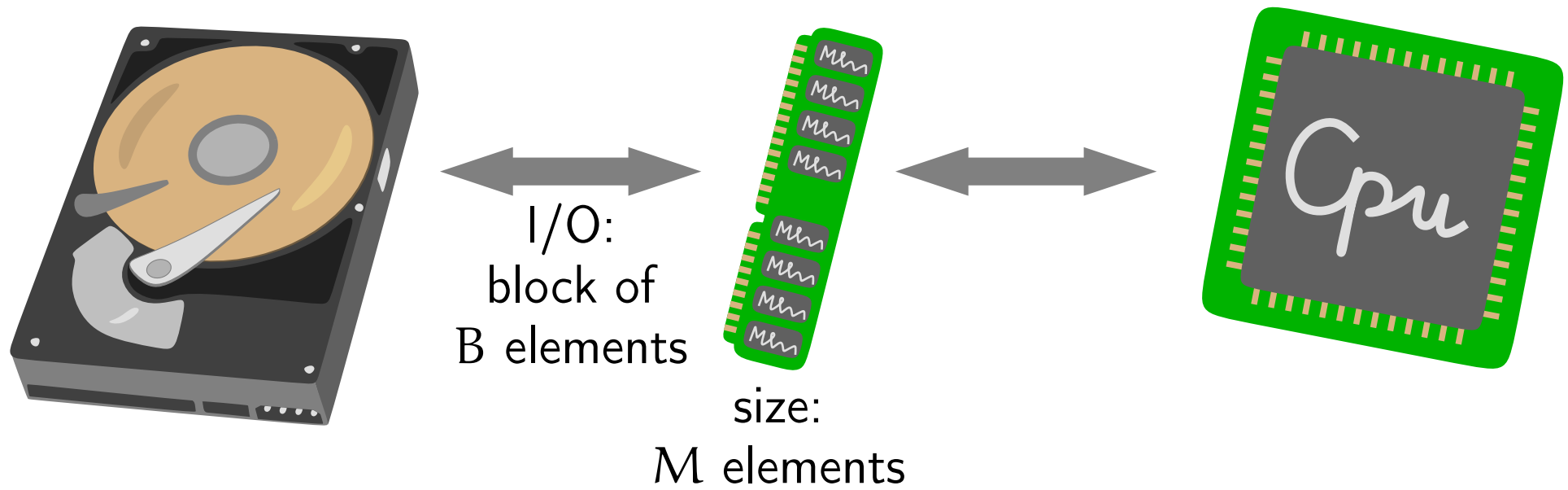
Dalhousie University

Canada

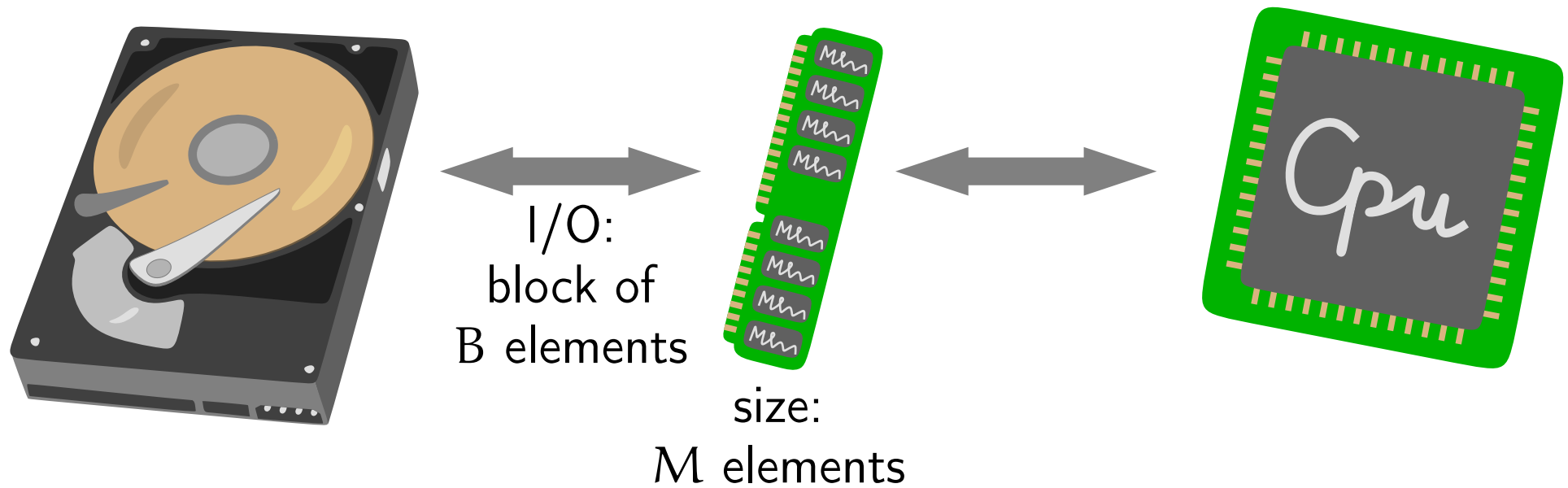
# Outline

- I/O-efficient planar graph algorithms
- Definition multiway simple cycle separator
- Internal-memory construction
- Summary

# I/O-efficient algorithms

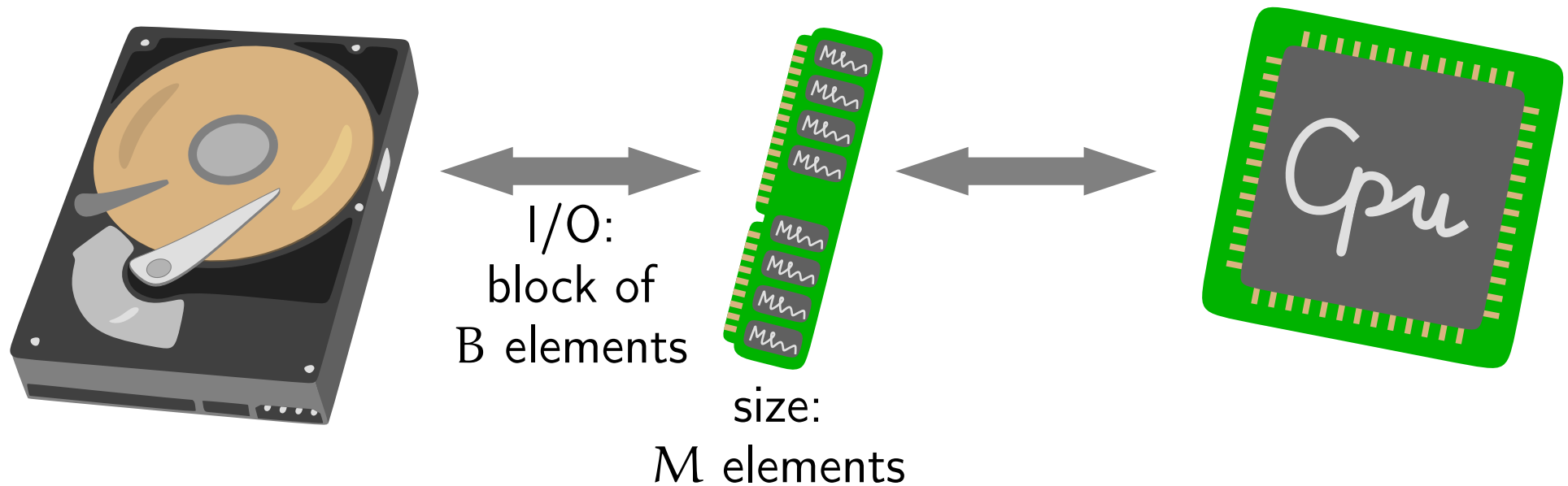


# I/O-efficient algorithms



I/O model: analyze number of I/Os between internal and external memory

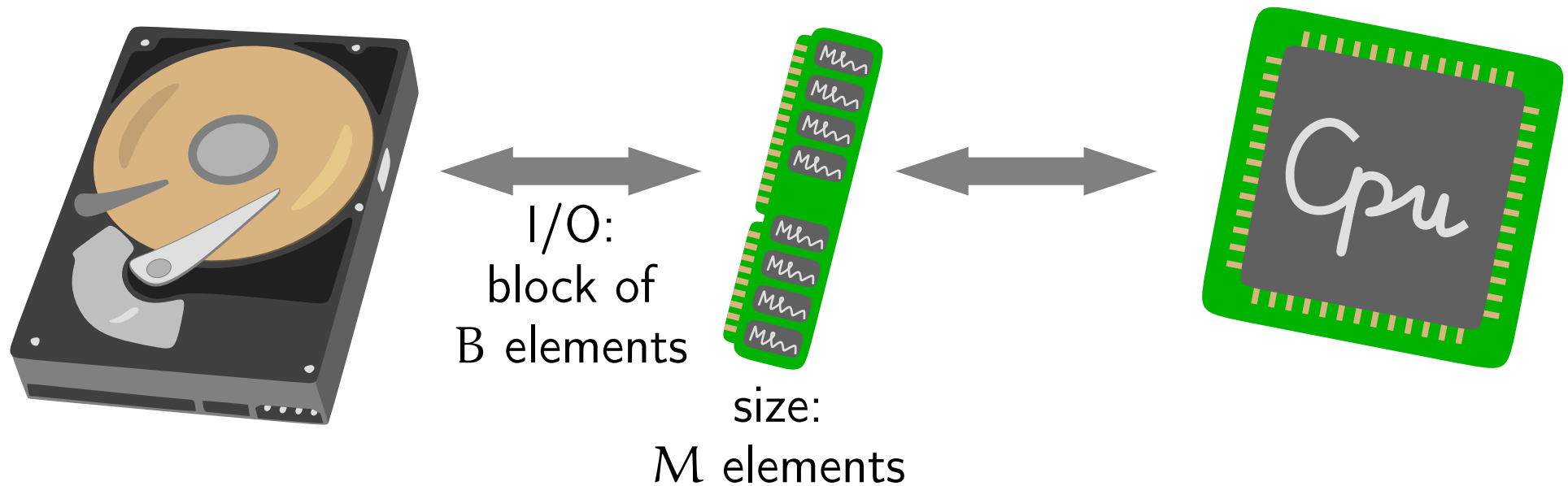
# I/O-efficient algorithms



I/O model: analyze number of I/Os between internal and external memory

- Scanning  $N$  elements:  $\Theta(N/B)$  I/Os

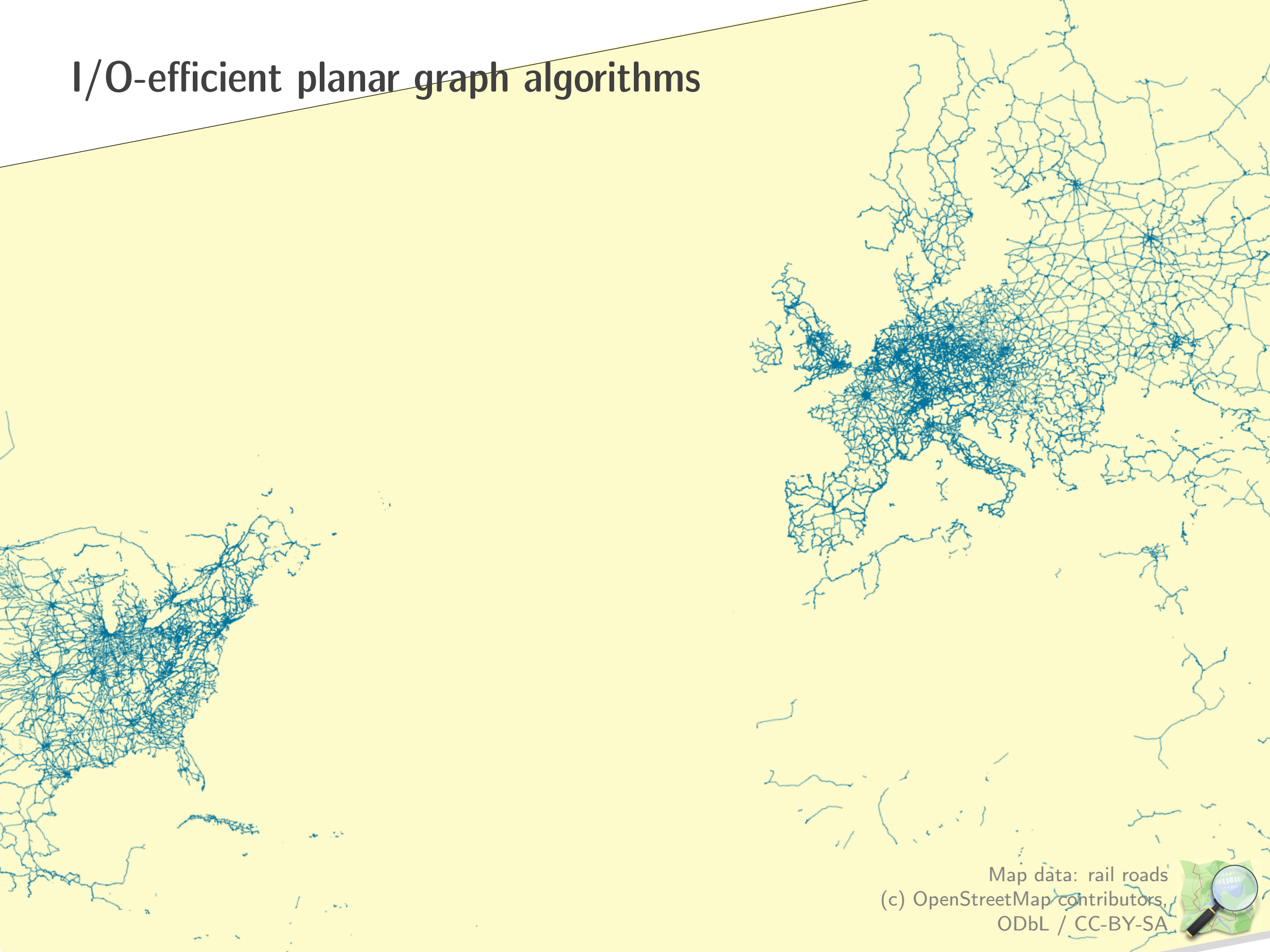
# I/O-efficient algorithms



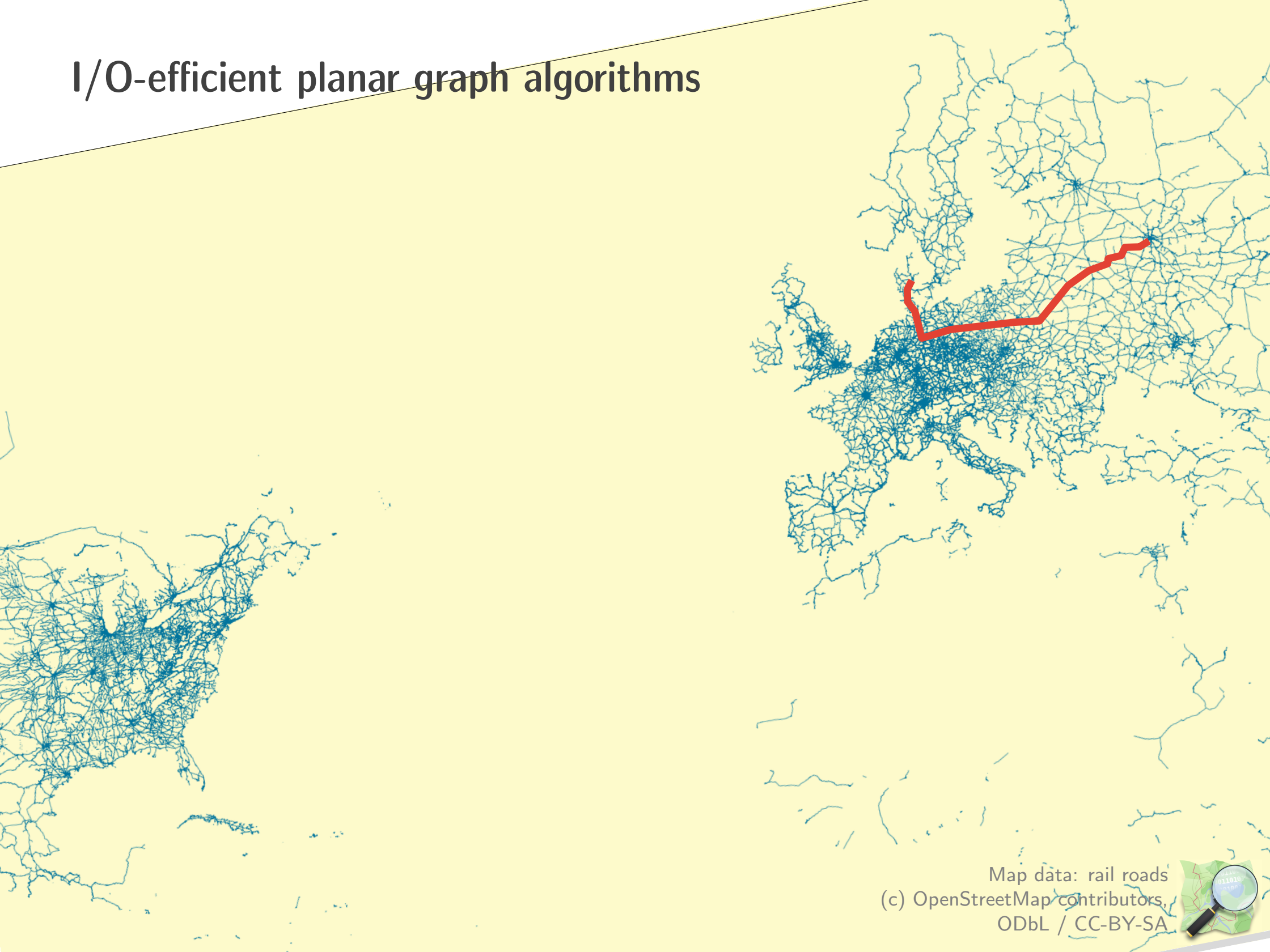
I/O model: analyze number of I/Os between internal and external memory

- Scanning  $N$  elements:  $\Theta(N/B)$  I/Os
- Sorting  $N$  elements:  $\Theta(\text{sort}(N)) = \Theta\left(\frac{N}{B} \log_{M/B} \frac{N}{B}\right)$  I/Os

# I/O-efficient planar graph algorithms



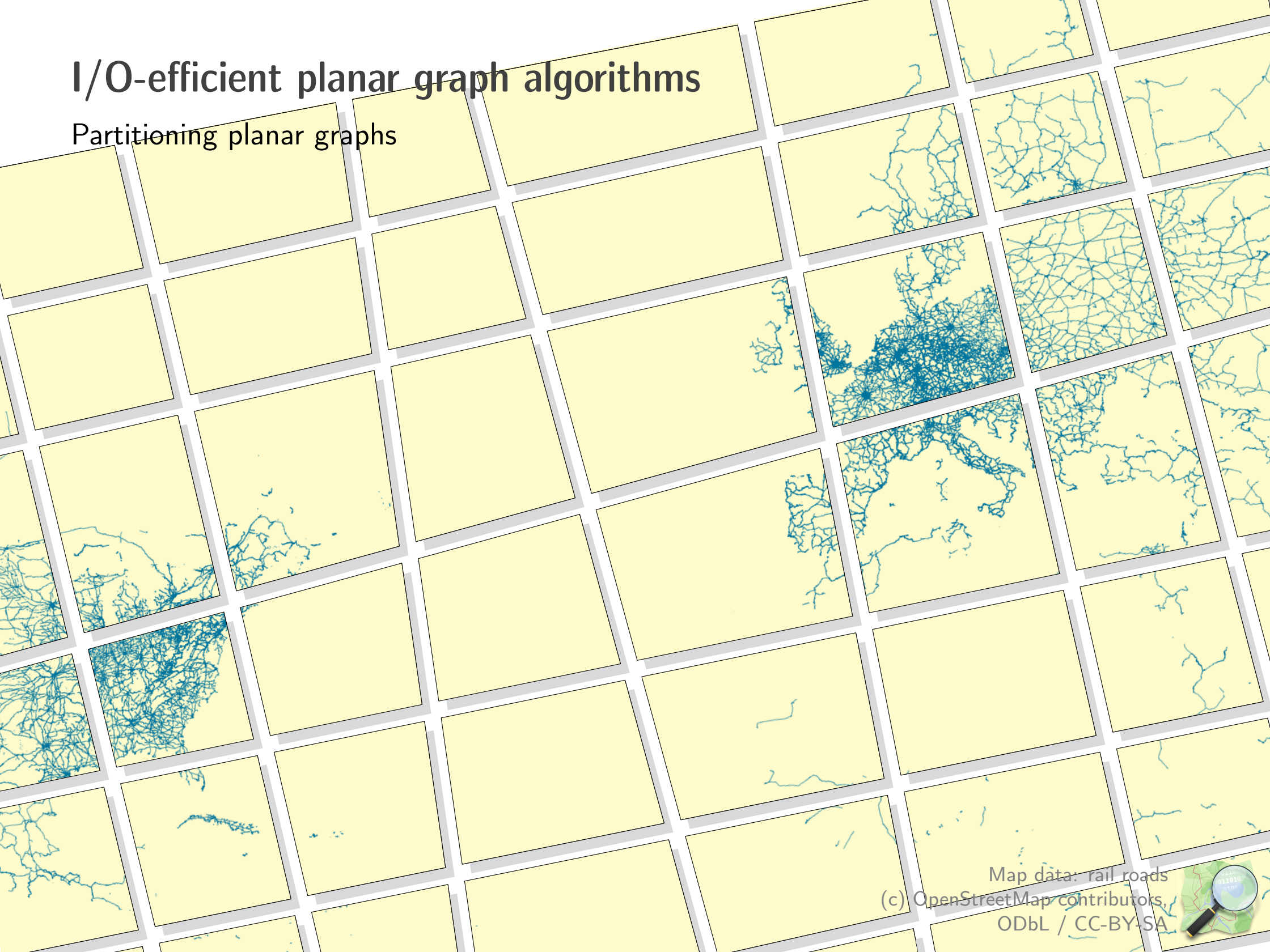
# I/O-efficient planar graph algorithms





# I/O-efficient planar graph algorithms

Partitioning planar graphs



# I/O-efficient planar graph algorithms

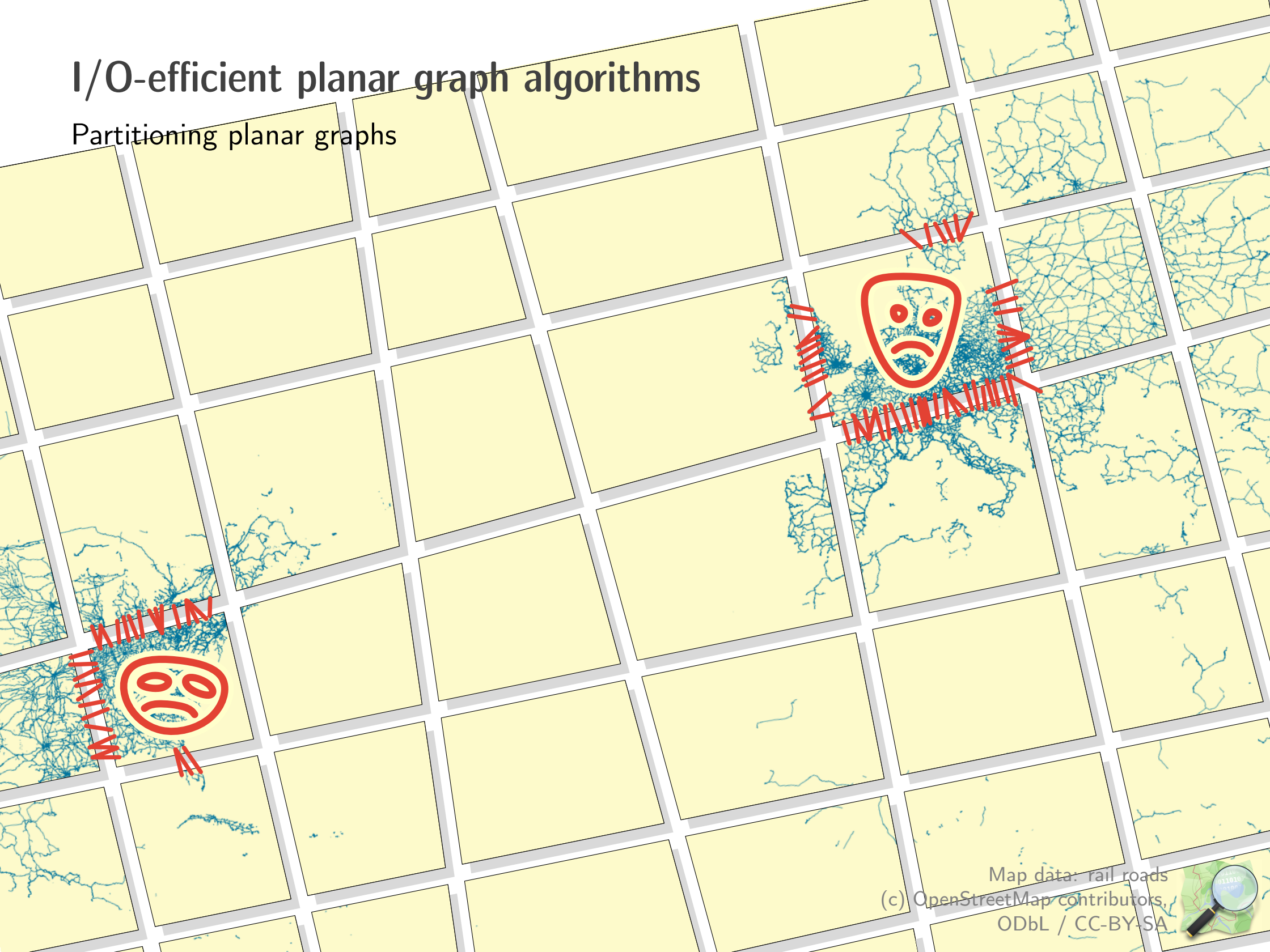
Partitioning planar graphs





# I/O-efficient planar graph algorithms

Partitioning planar graphs



# I/O-efficient planar graph algorithms

## Partitioning planar graphs

Goal: partition planar graphs with guarantees on

- size of regions
- “perimeter” of regions
- (internal-memory) computation time
- # I/Os ( $O(\text{sort}(N))$ )

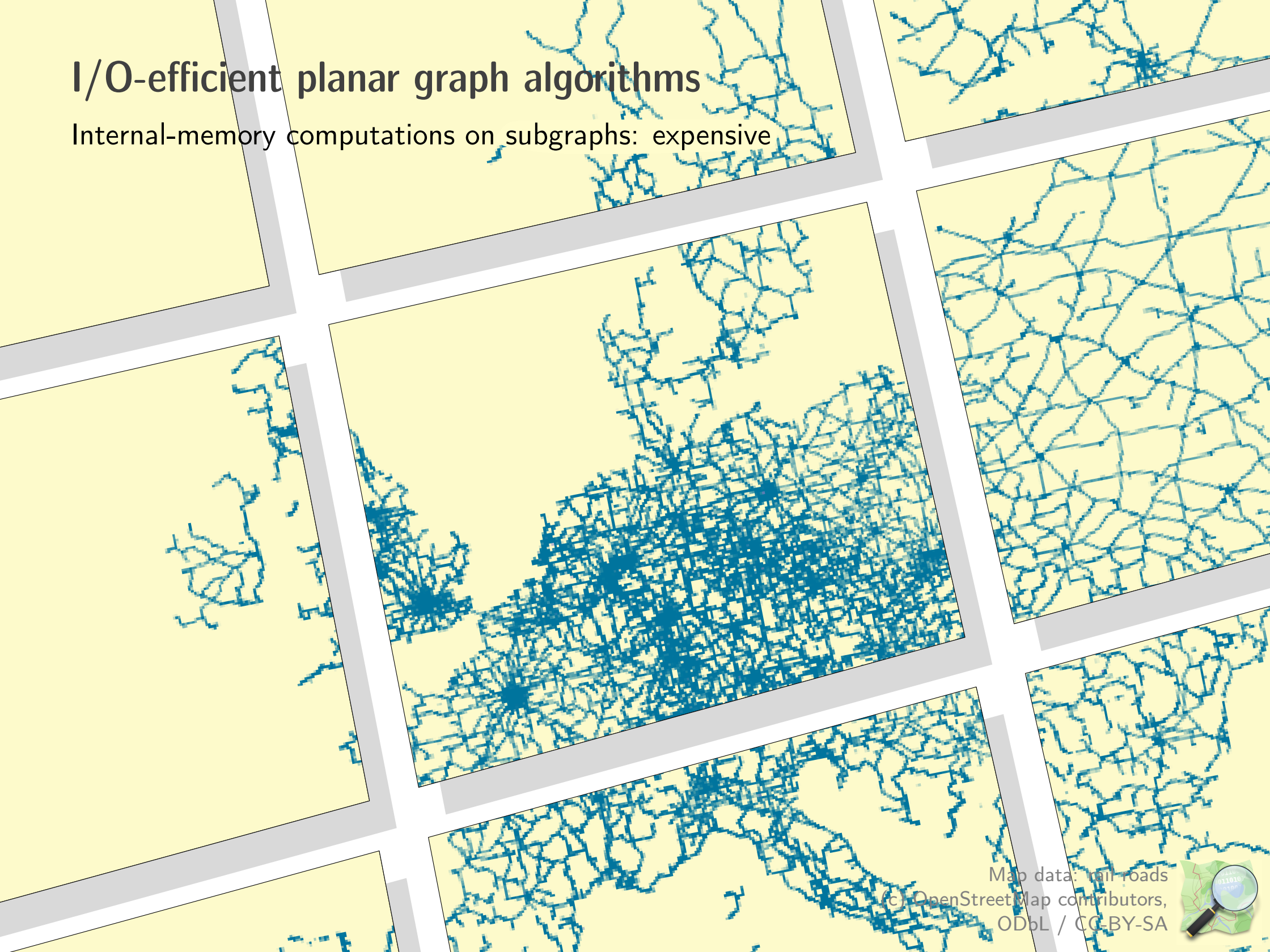
Map data: rail roads

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# I/O-efficient planar graph algorithms

Internal-memory computations on subgraphs: expensive



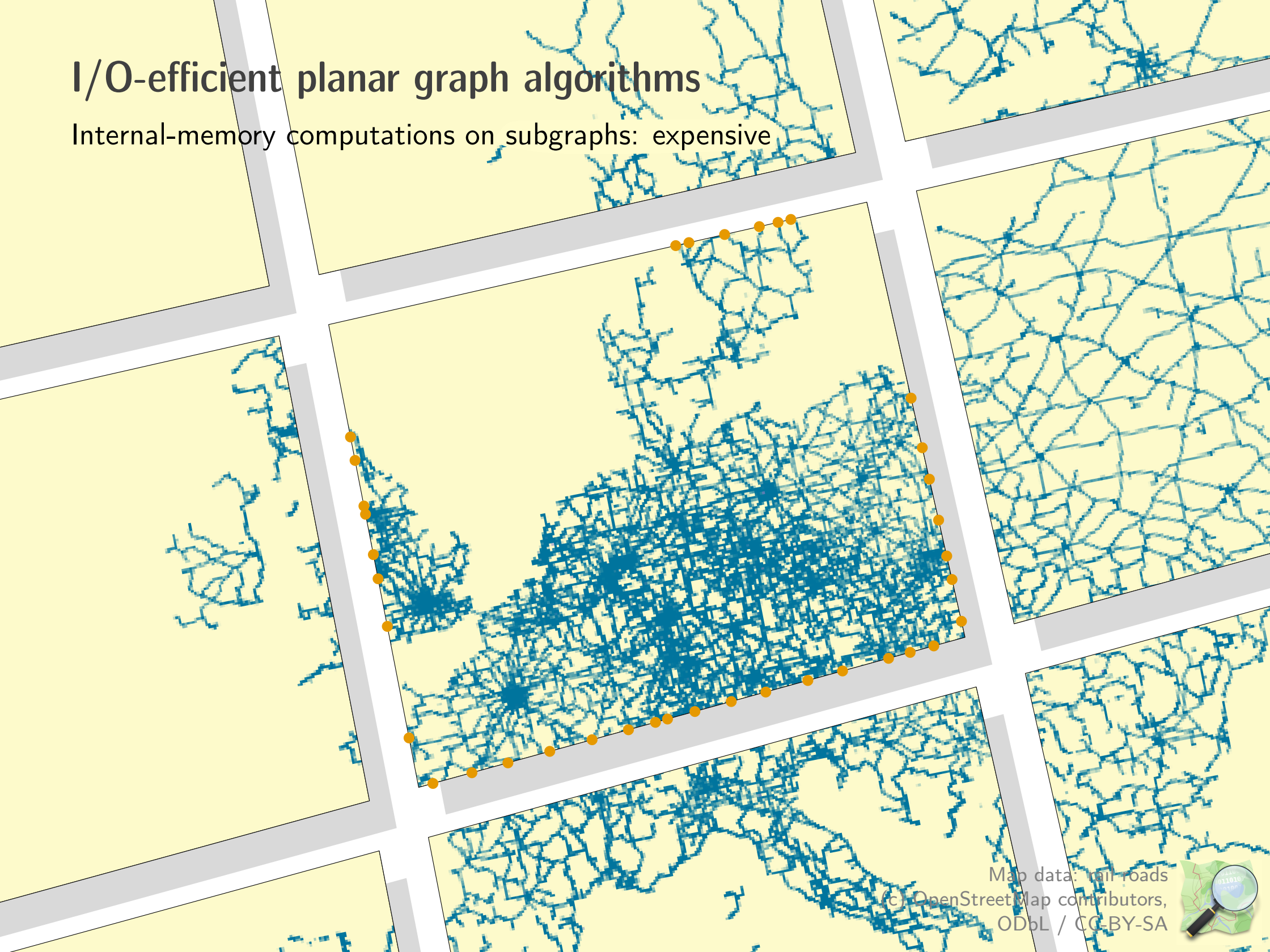
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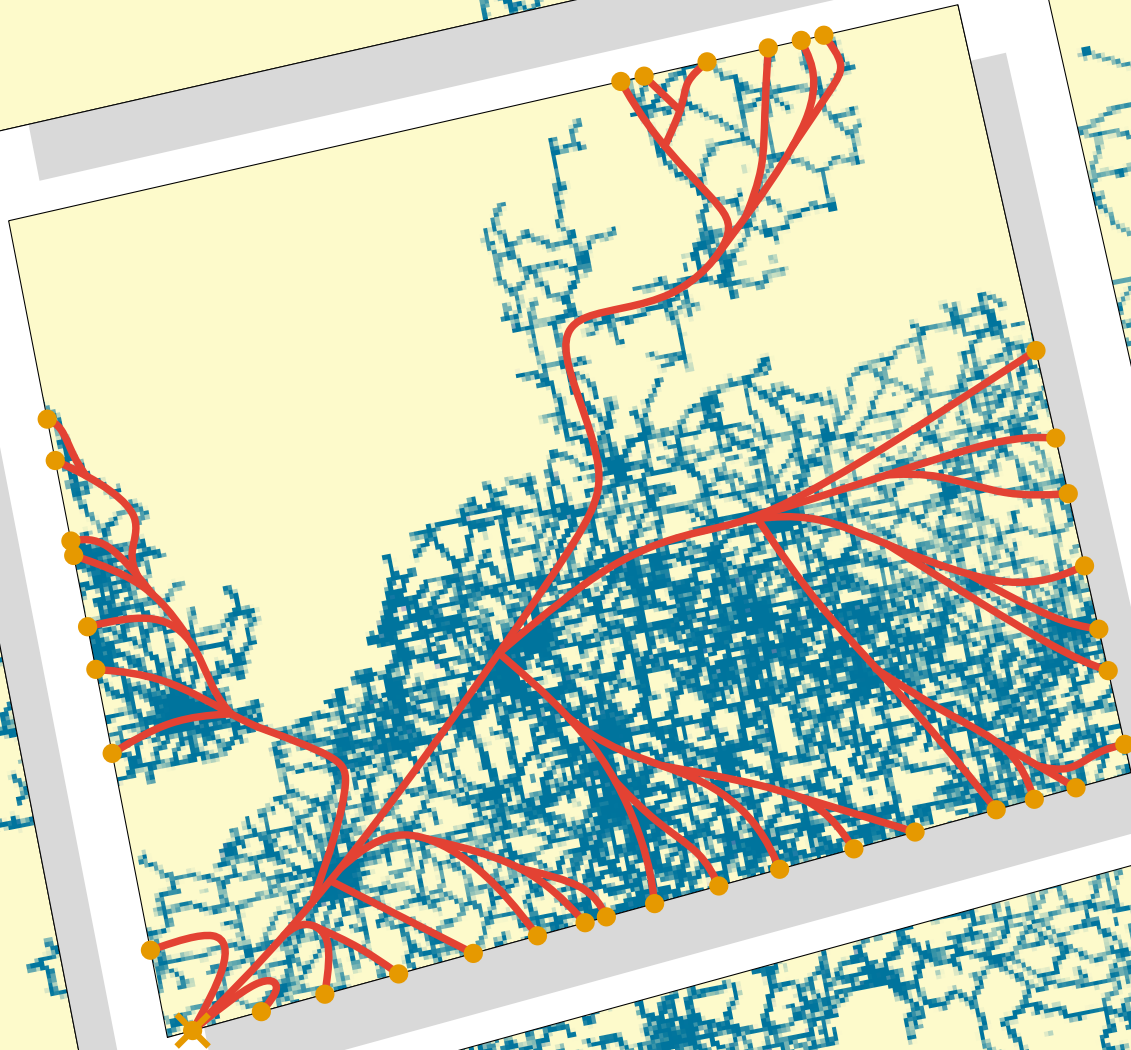


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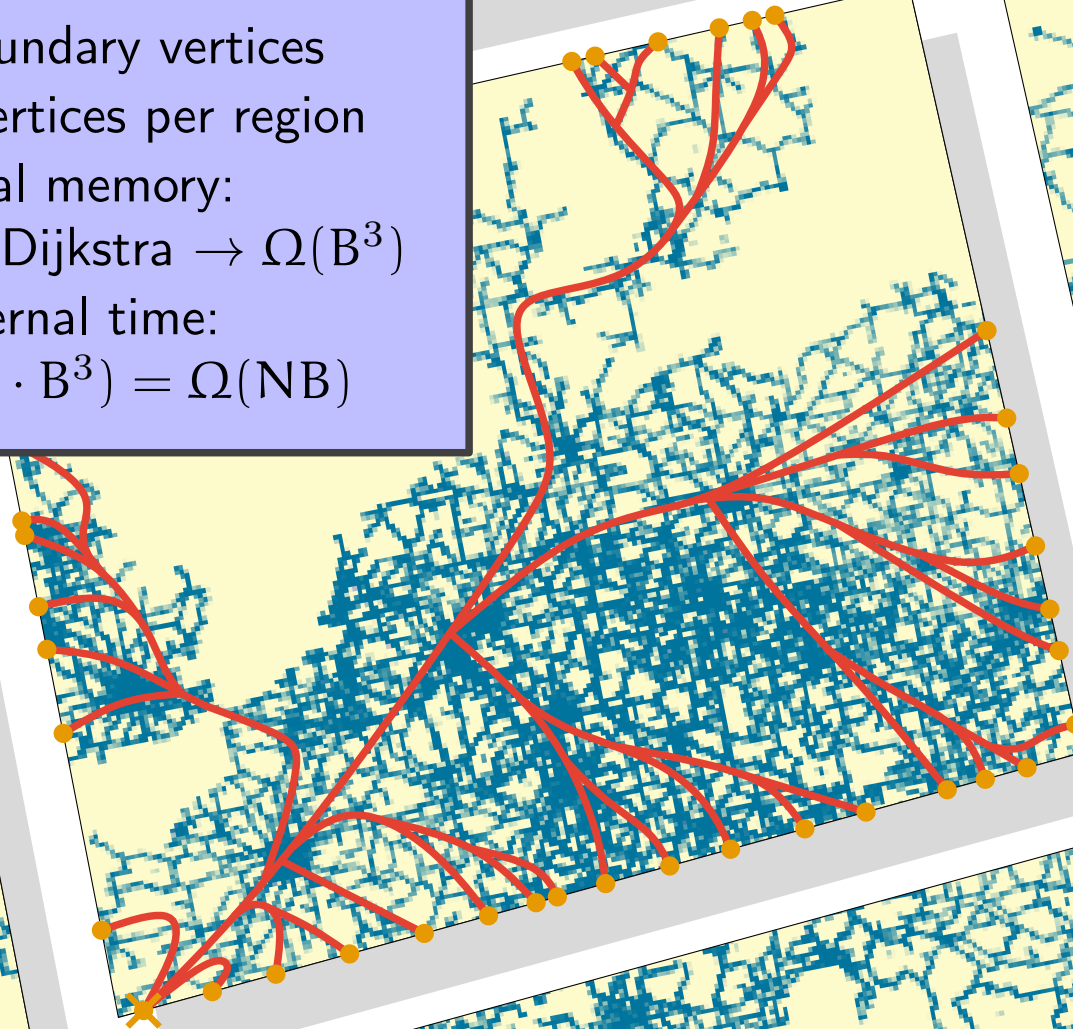




# I/O-efficient planar graph algorithms

Internal-memory computations on subgraphs: expensive

- $\Theta(B)$  boundary vertices
- $\Theta(B^2)$  vertices per region
- in internal memory:  
 $B \times \text{BFS/Dijkstra} \rightarrow \Omega(B^3)$
- total internal time:  
 $\Omega(N/B^2 \cdot B^3) = \Omega(NB)$





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Note: same as  $O(N)$  internal-memory algorithm!



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Alternative:

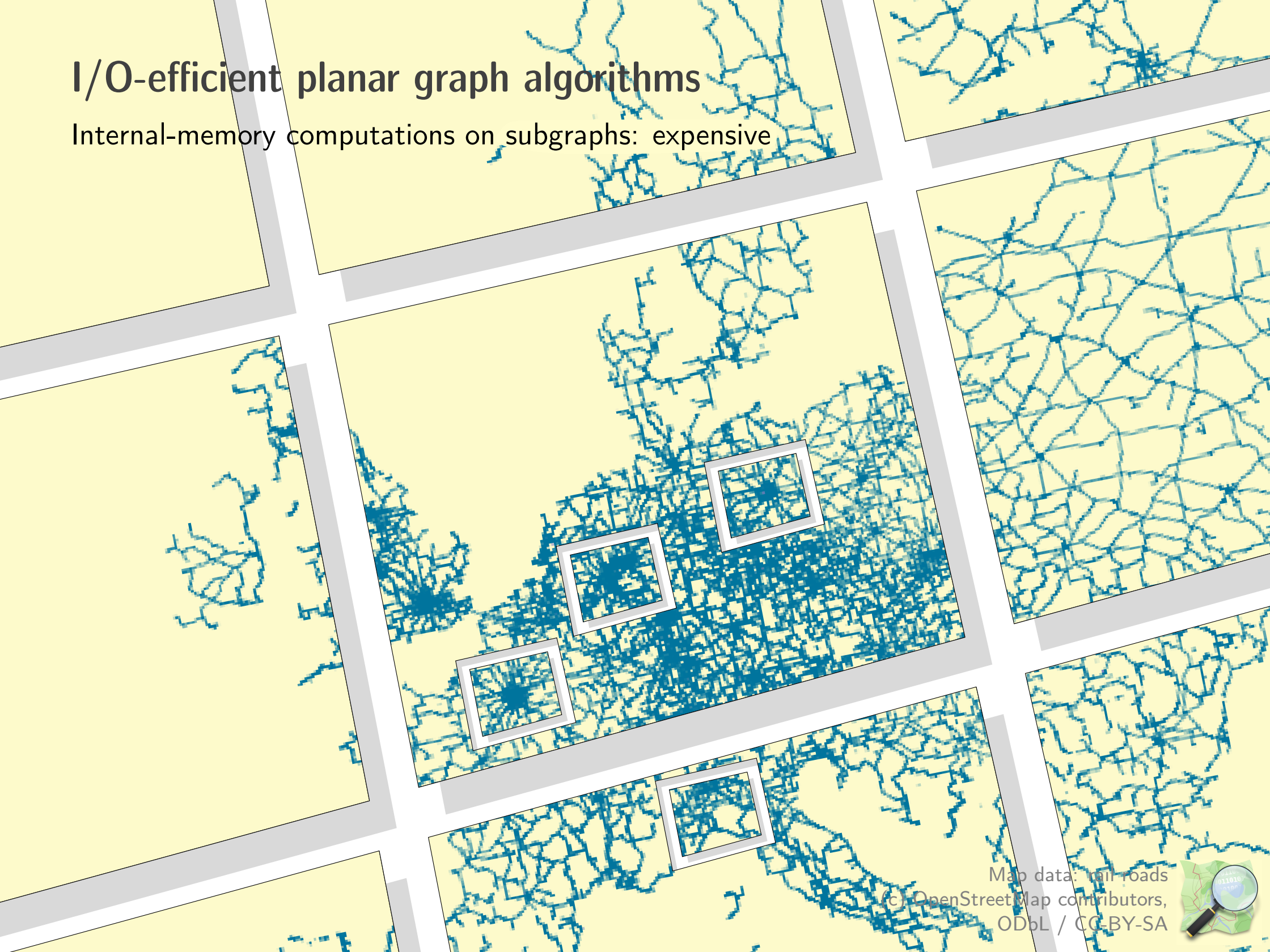
- use Klein's algorithm [2005]  
using  $O(B^2 \log B)$  time
- hence  $O(N/B^2 \cdot B^2 \log B) =$   
 $O(N \log N)$  total time  
BUT...





# I/O-efficient planar graph algorithms

Internal-memory computations on subgraphs: expensive



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Internal-memory computations on subgraphs: expensive

$O(1)$  holes... we can handle



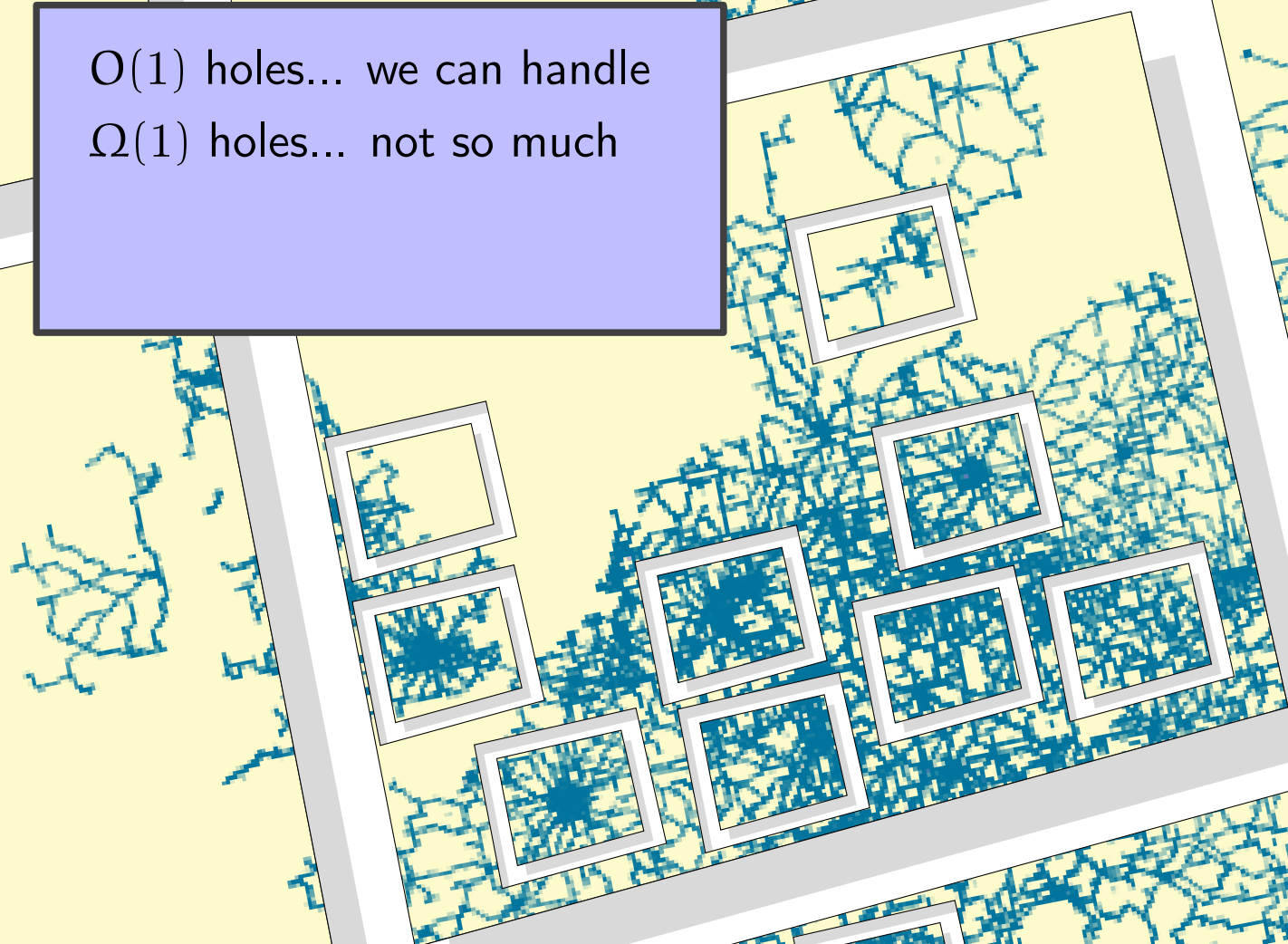


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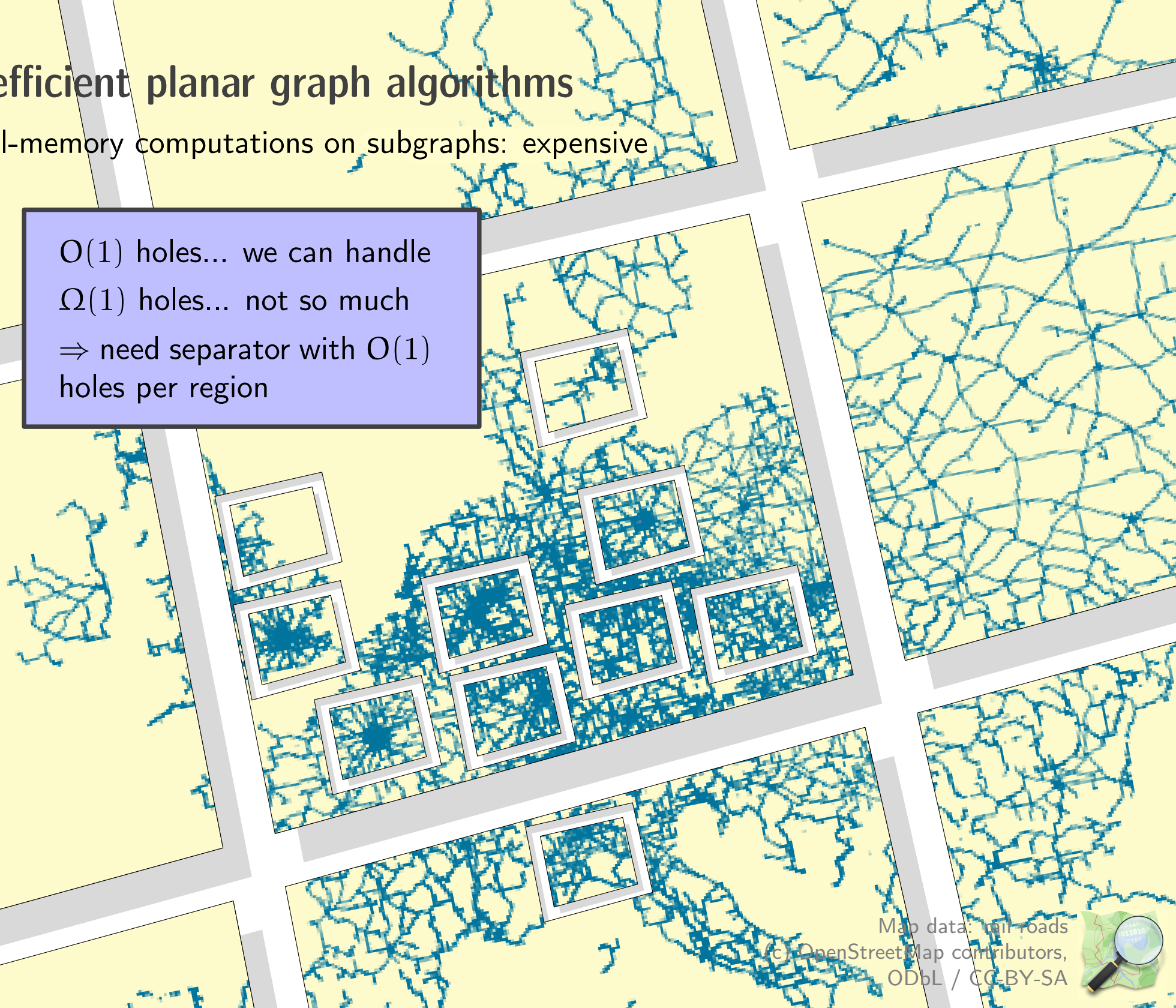
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# I/O-efficient planar graph algorithms

Internal-memory computations on subgraphs: expensive

$O(1)$  holes... we can handle  
 $\Omega(1)$  holes... not so much  
 $\Rightarrow$  need separator with  $O(1)$   
holes per region



# Multiway simple cycle separators: definition and previous work

Given parameter  $\varepsilon$  ( $0 < \varepsilon < 1$ ):

multiway simple cycle separator of triangulated planar graph  $G$  of  $N$  vertices partitions  $G$  into (not necessarily connected) regions, such that:

- Number of regions =  $O(1/\varepsilon)$
- Region size =  $O(\varepsilon N)$
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Previous work:

- Italiano, Nussbaum, Sankowski, Wulff-Nilsen: Improved algorithms for min cut and max flow in undirected planar graphs, STOC'11.  
 $O(N \log(\varepsilon N) + \sqrt{N/\varepsilon} \log N)$

Concurrent work:

- Klein, Mozes, Sommer: Structured recursive separator decompositions for planar graphs in linear time, arXiv:1208.2223.



# Multiway cycle separators: construction

Requirements:

- $O(1/\varepsilon)$  regions
- Region size  $O(\varepsilon N)$
- Region boundary  $O(\sqrt{\varepsilon N})$
- $O(1)$  holes per region

Big regions: size  $> \varepsilon N$

# Multiway cycle separators: construction

First: design  $O(N)$  time internal-memory algorithm

Overview of internal-memory algorithm:

Step 1. Partition into small or low-diameter regions

Step 2. Split big (low-diameter) regions

Step 3. Limit #regions, boundary sizes, and #holes per region

Second: make I/O-efficient, i.e.  $O(\text{sort}(N))$  I/Os,  $O(N \log N)$  time  
(Use bootstrapping with SSSP.)

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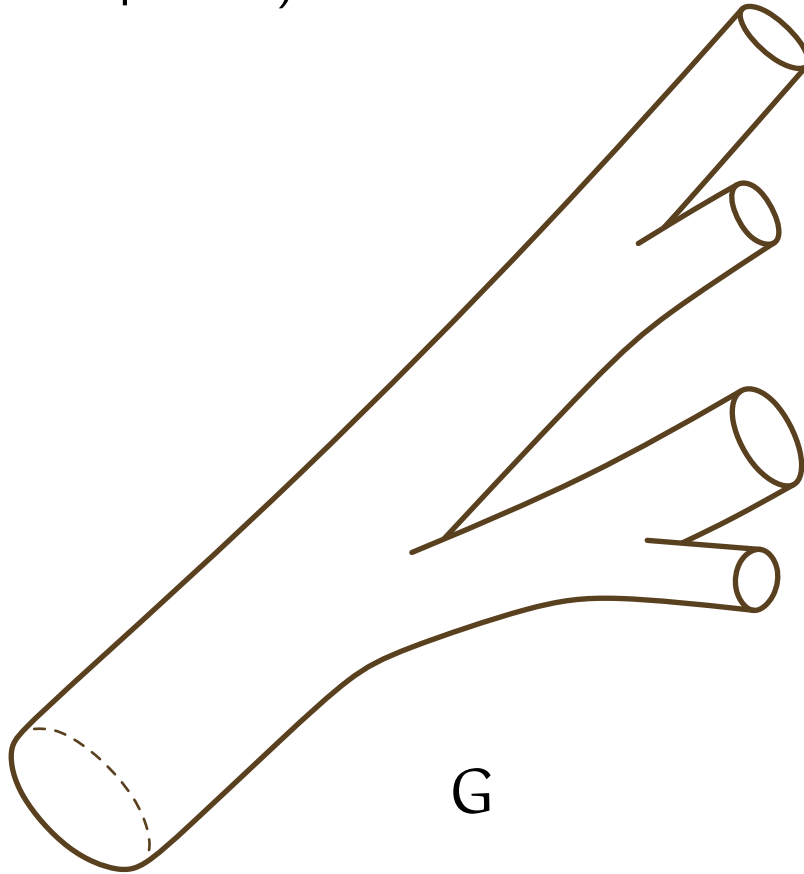
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## Step 1. Partition into small or low-diameter regions

BFS on face-incidence graph (like Miller's two-way simple cycle separator)



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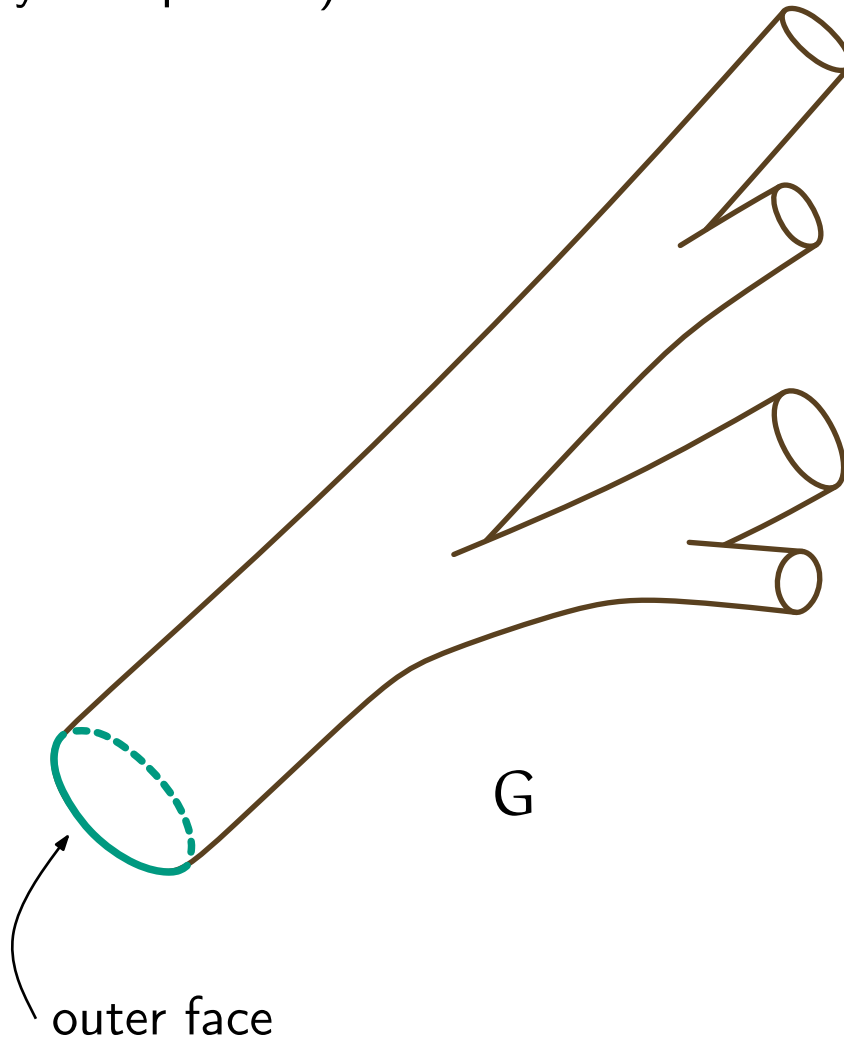
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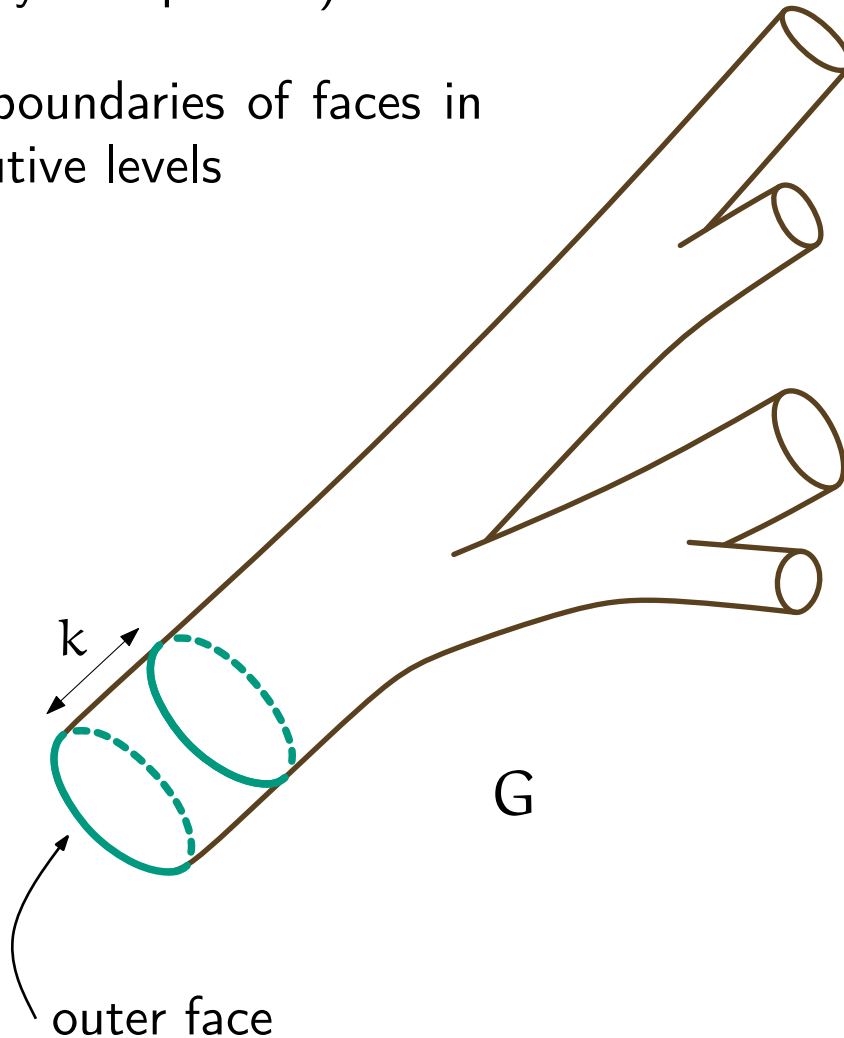
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Select boundaries of faces in consecutive levels



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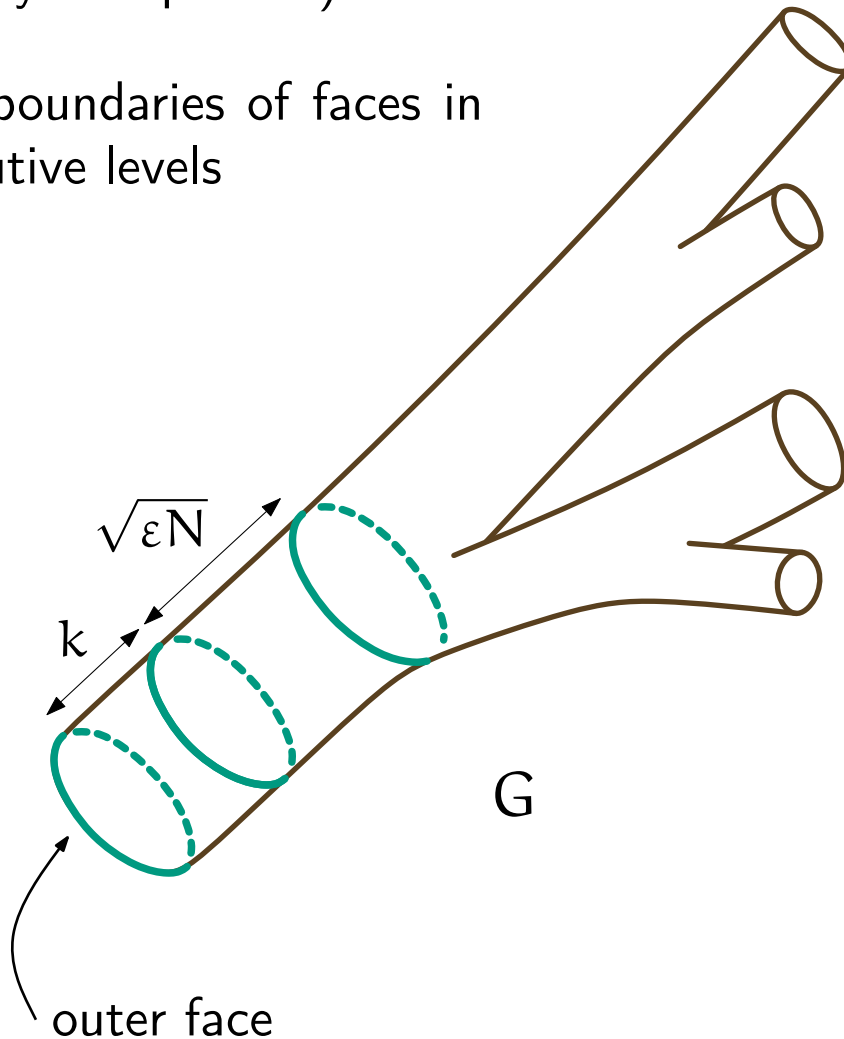
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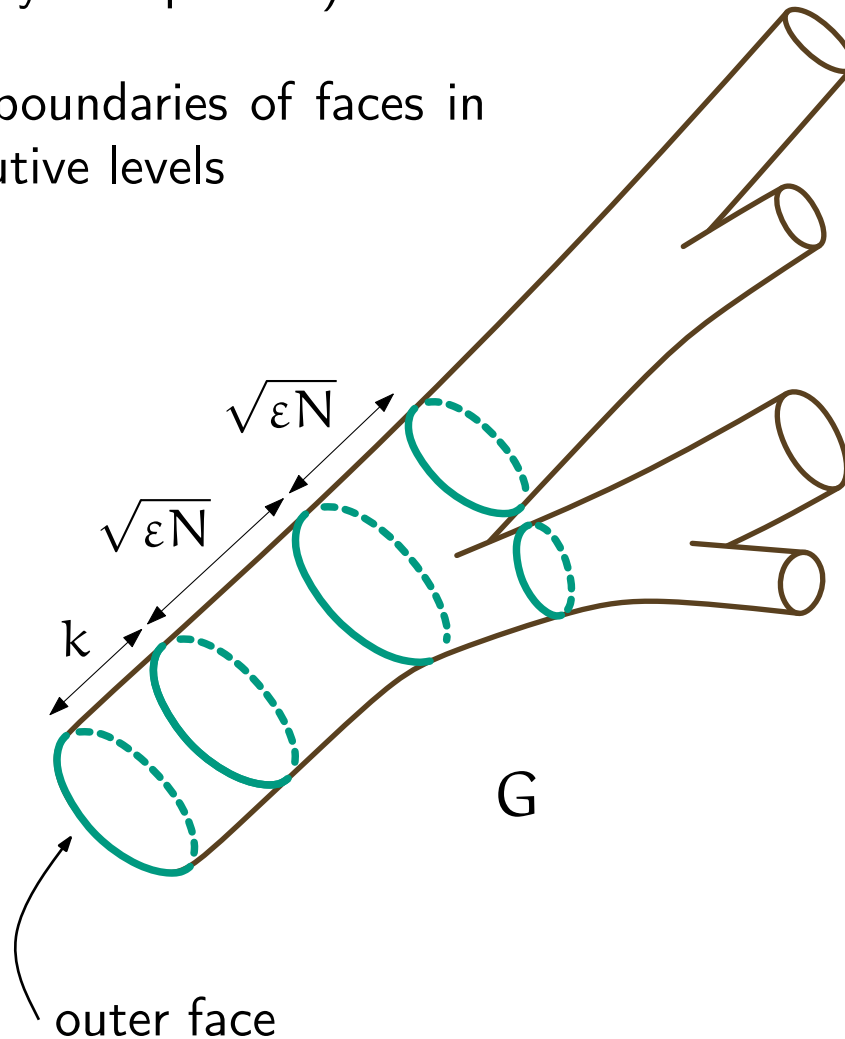
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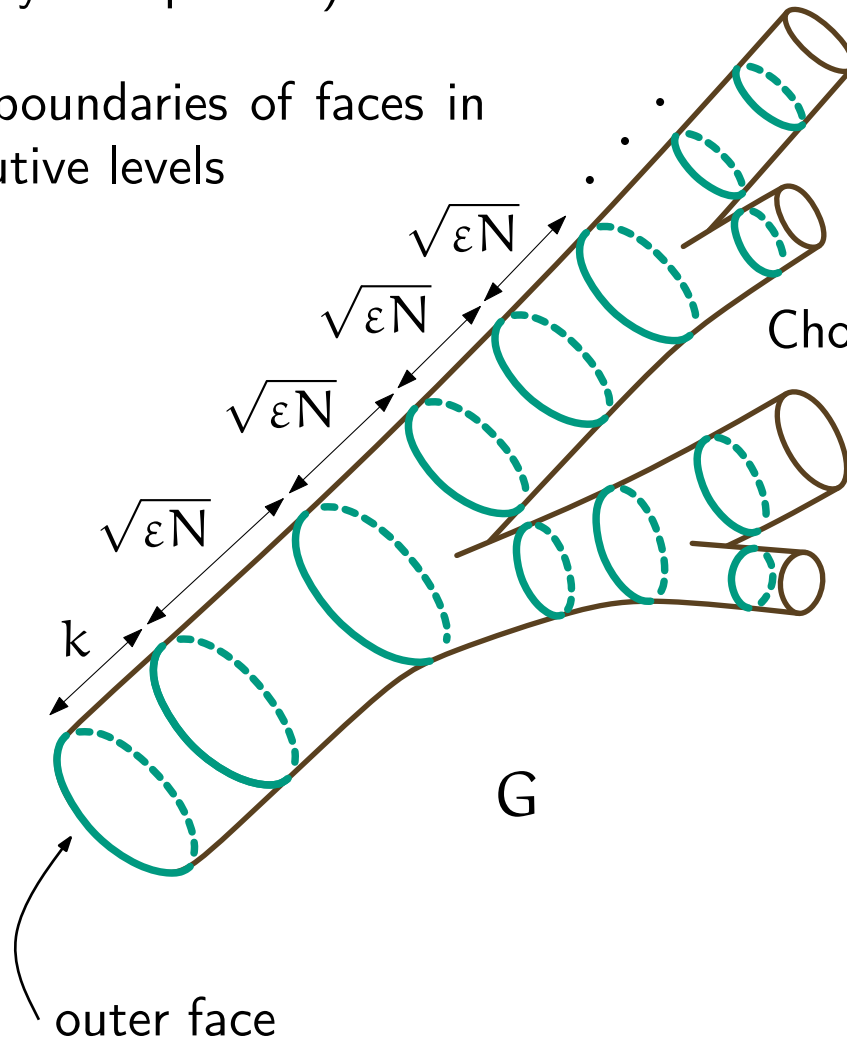


# Multiway cycle separators: construction

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BFS on face-incidence graph (like Miller's two-way simple cycle separator)

Select boundaries of faces in consecutive levels



Choose  $k$  such that  $\#$ selected edges =  $O(\sqrt{N/\epsilon})$

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- Region size  $O(\epsilon N)$
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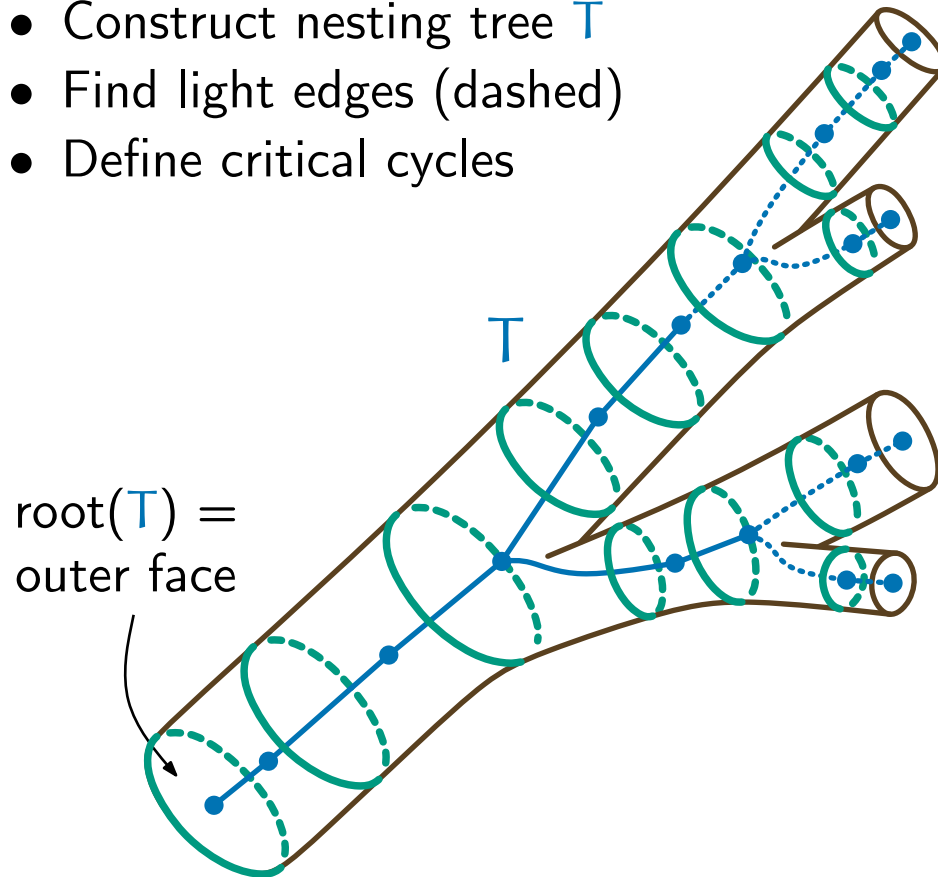
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# Multiway cycle separators: construction

## Step 1. Partition into small or low-diameter regions

Reduce #boundary cycles:

- Construct nesting tree  $T$
- Find light edges (dashed)
- Define critical cycles



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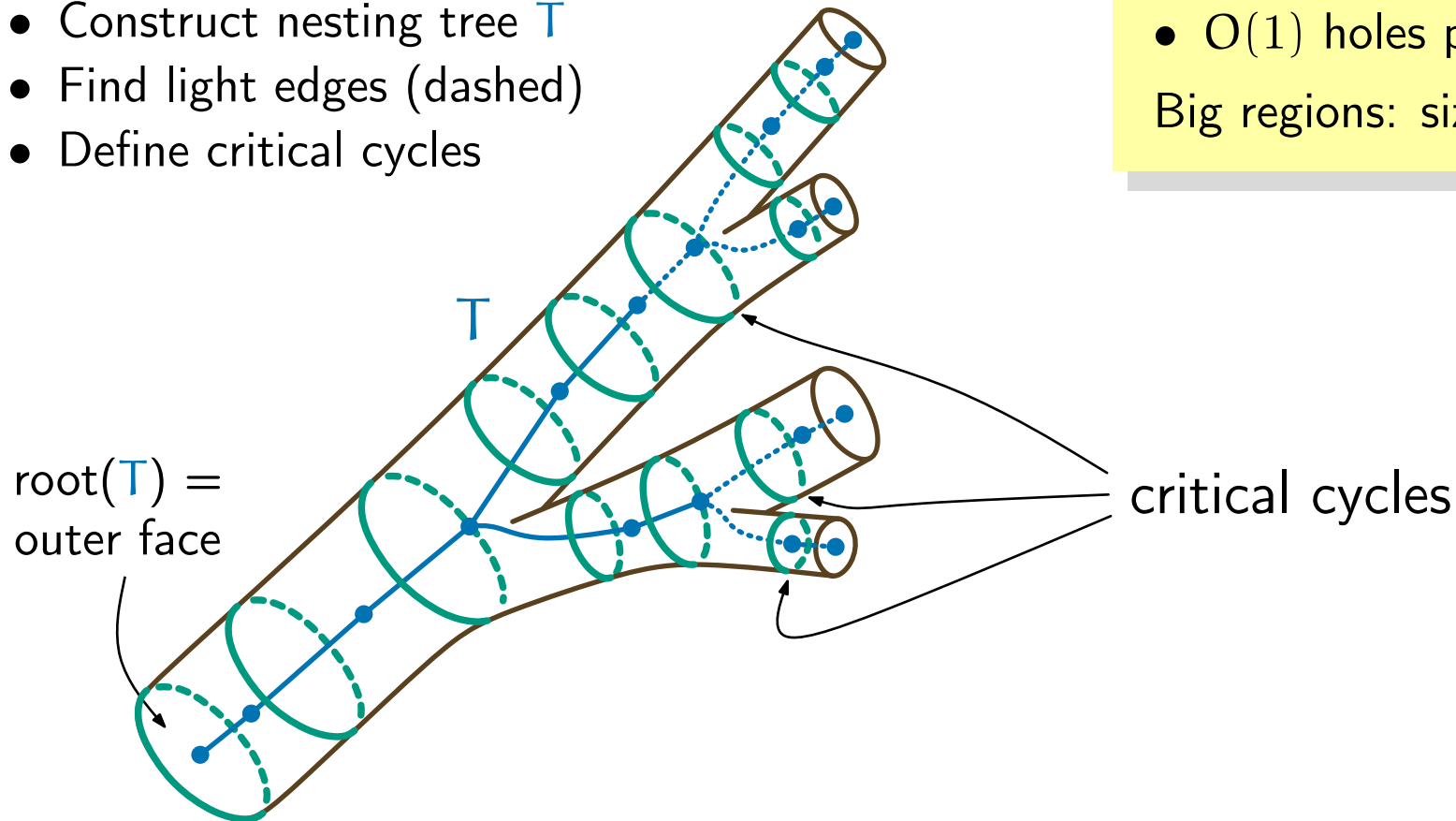
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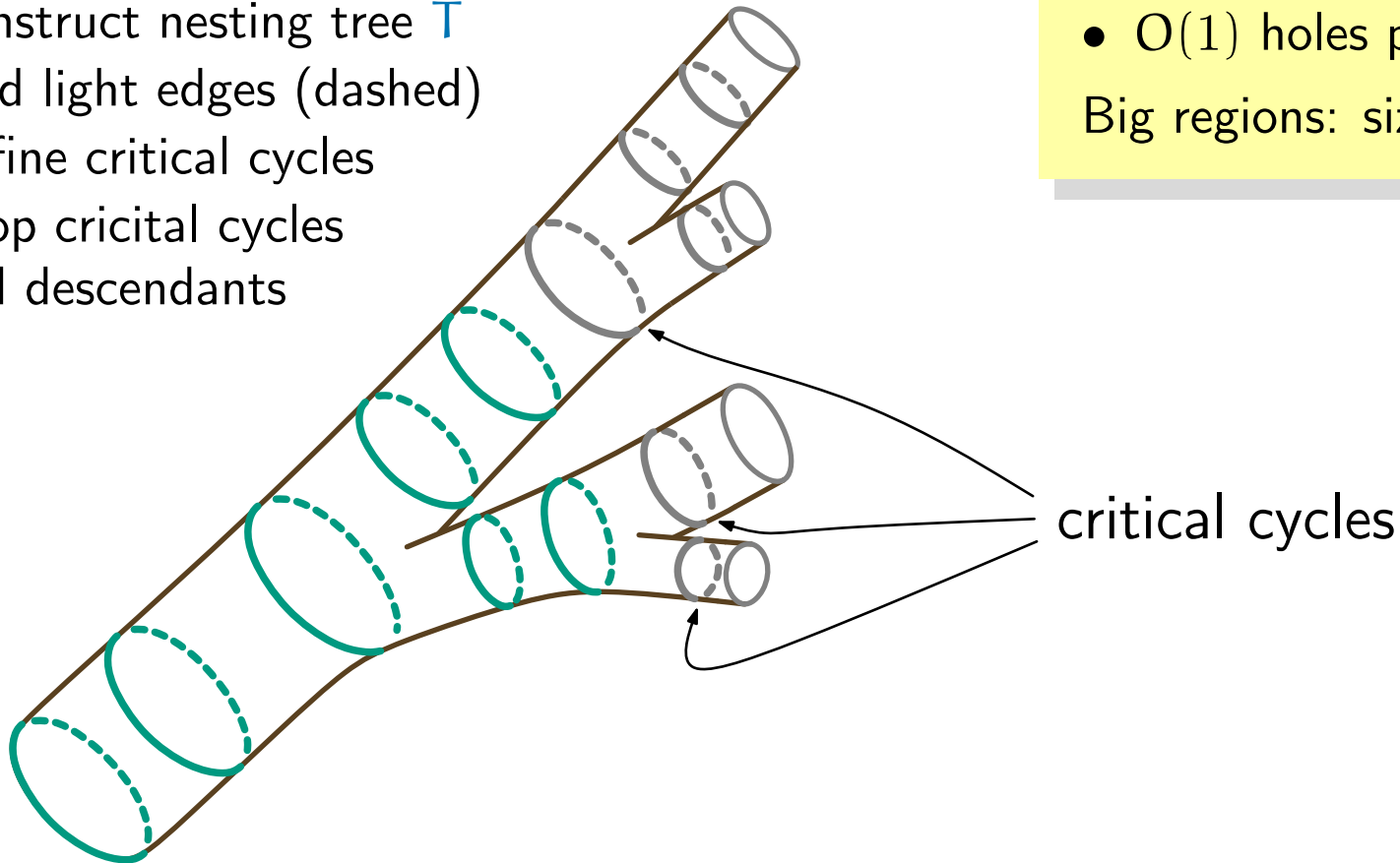
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# Multiway cycle separators: construction

## Step 1. Partition into small or low-diameter regions

Reduce #boundary cycles:

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- Find light edges (dashed)
- Define critical cycles
- Drop critical cycles and descendants



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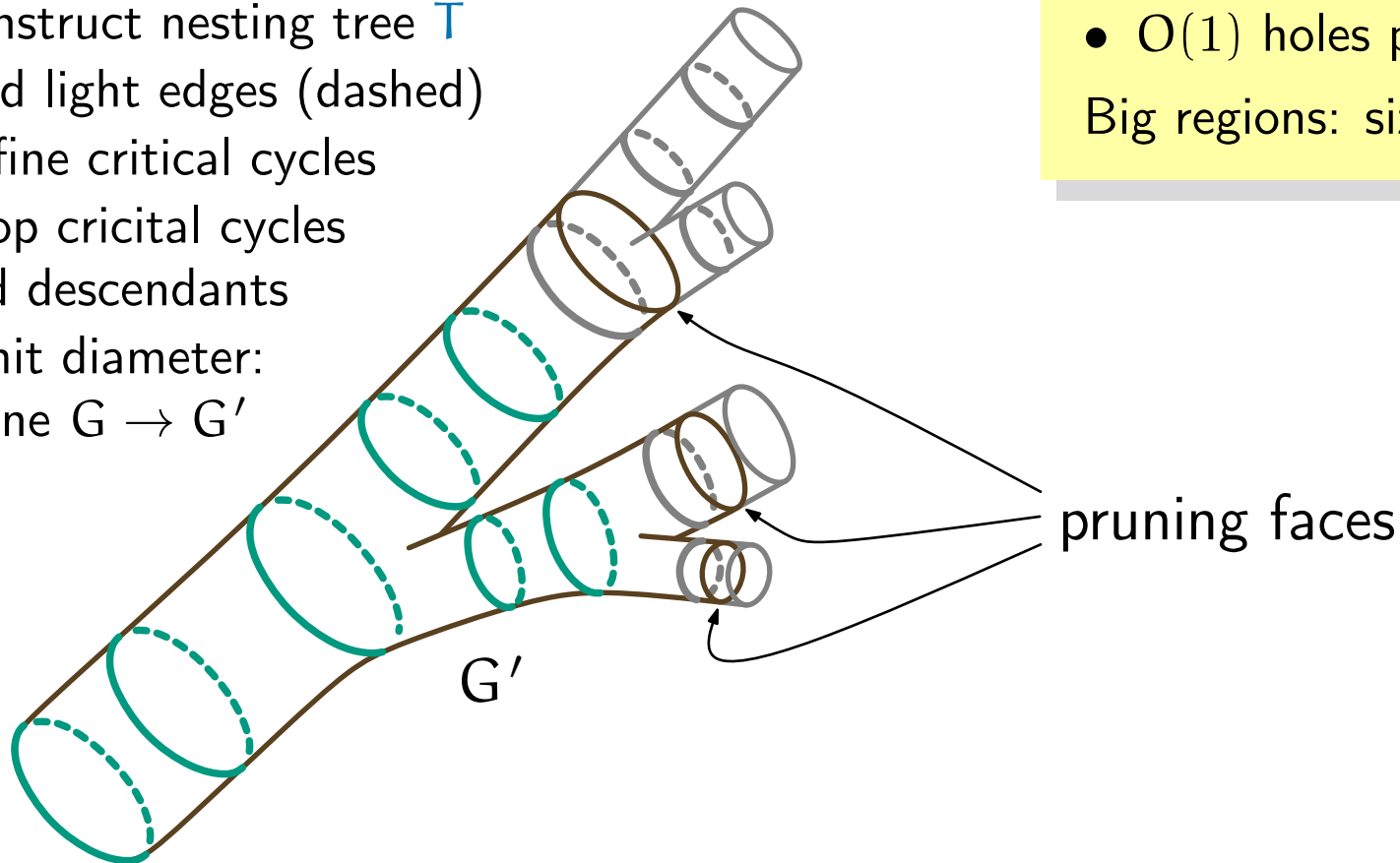
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# Multiway cycle separators: construction

## Step 1. Partition into small or low-diameter regions

Reduce #boundary cycles:

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- Drop critical cycles and descendants
- Limit diameter: prune  $G \rightarrow G'$



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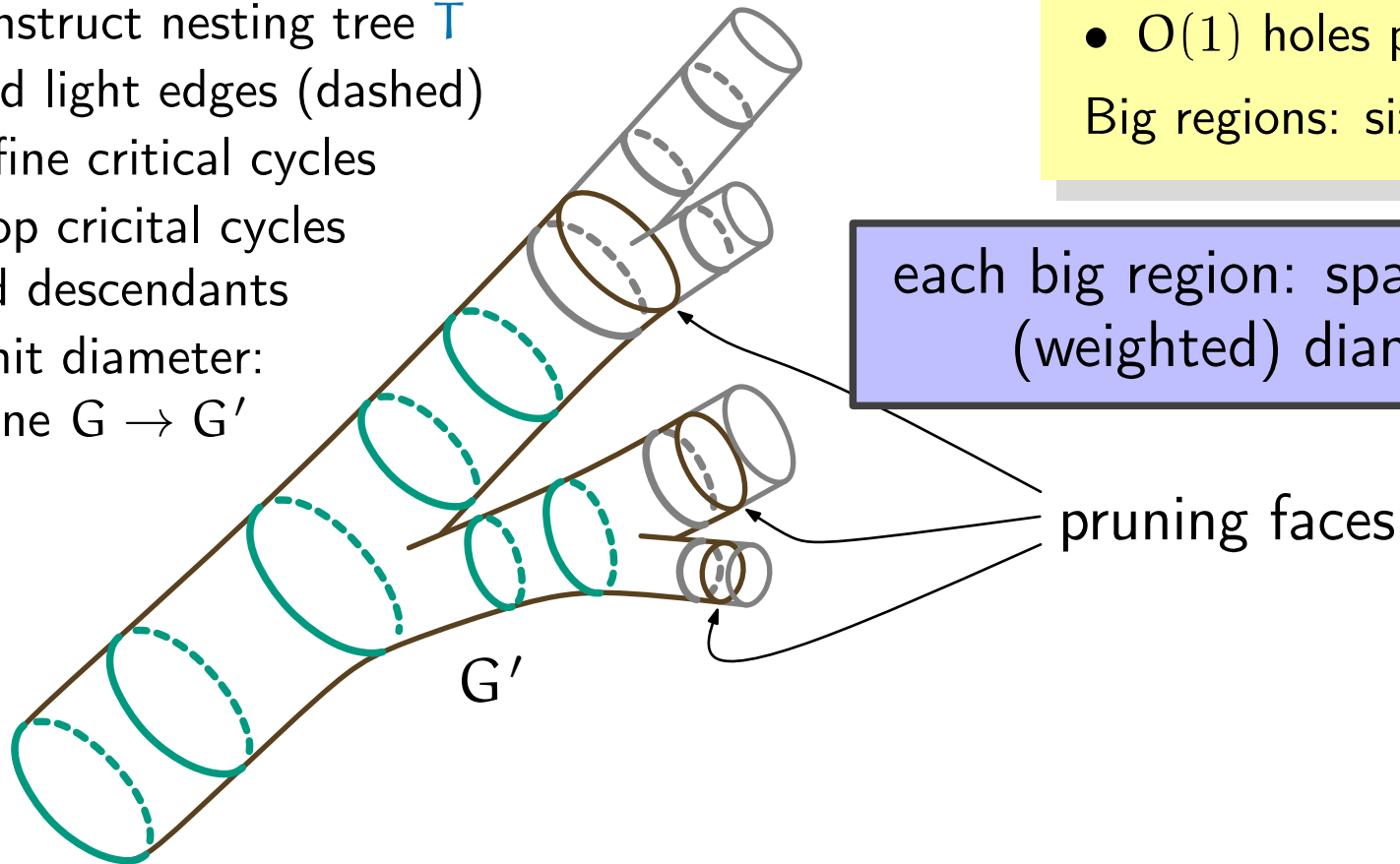
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each big region: spanning tree with (weighted) diameter  $\sqrt{\epsilon N}$

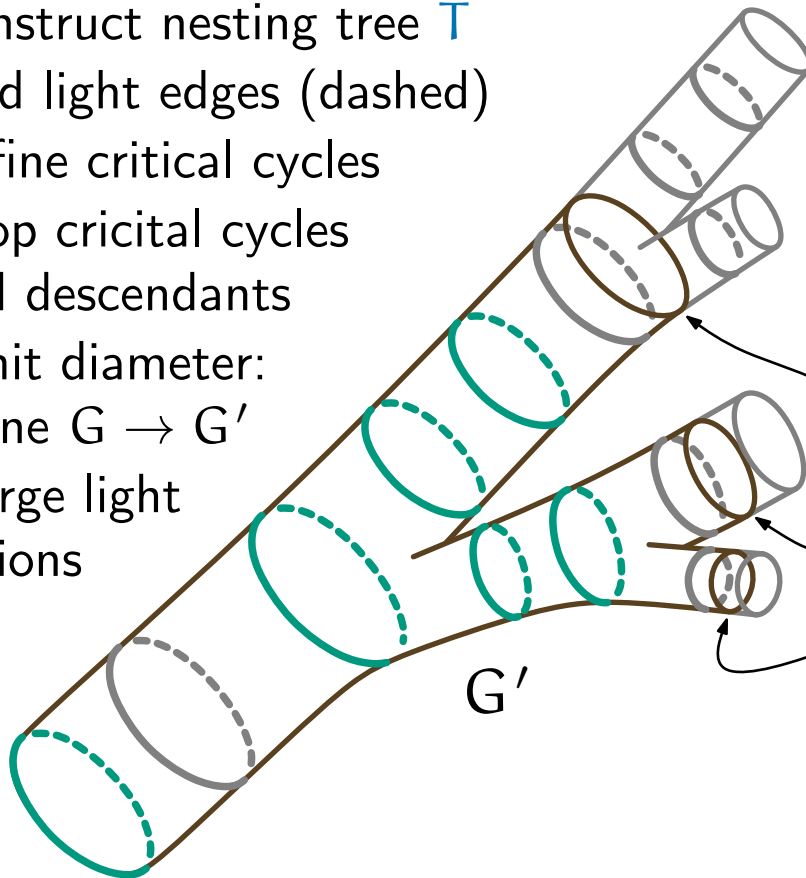
pruning faces

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- Merge light regions



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pruning faces

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## Step 2. Split big (low-diameter) regions

Goal: Partition  $G'$  (and  $G$ ) into small regions

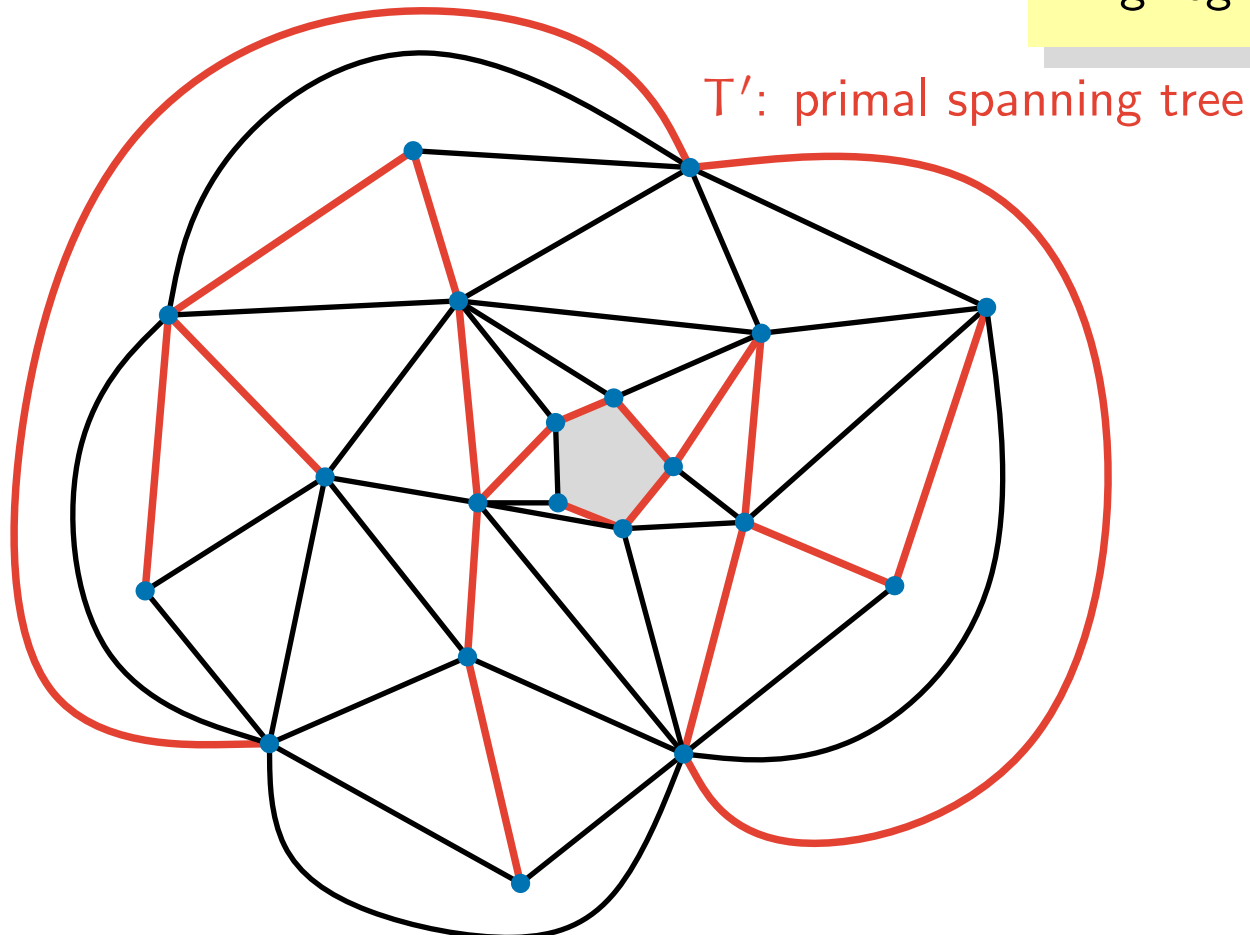
Step 2.1: Separation tree decomposition

Step 2.2: Nesting forest decomposition

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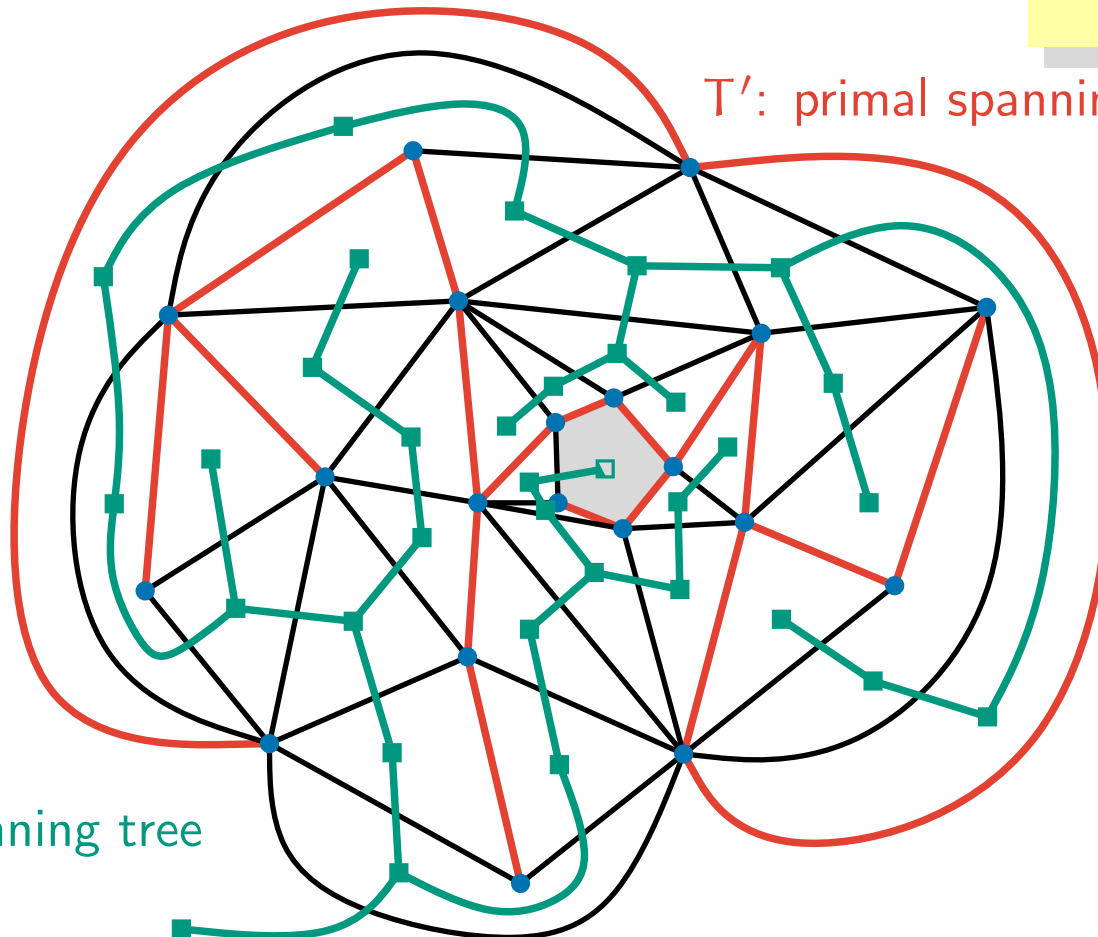
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$T'$ : primal spanning tree

$T^*$ : dual spanning tree

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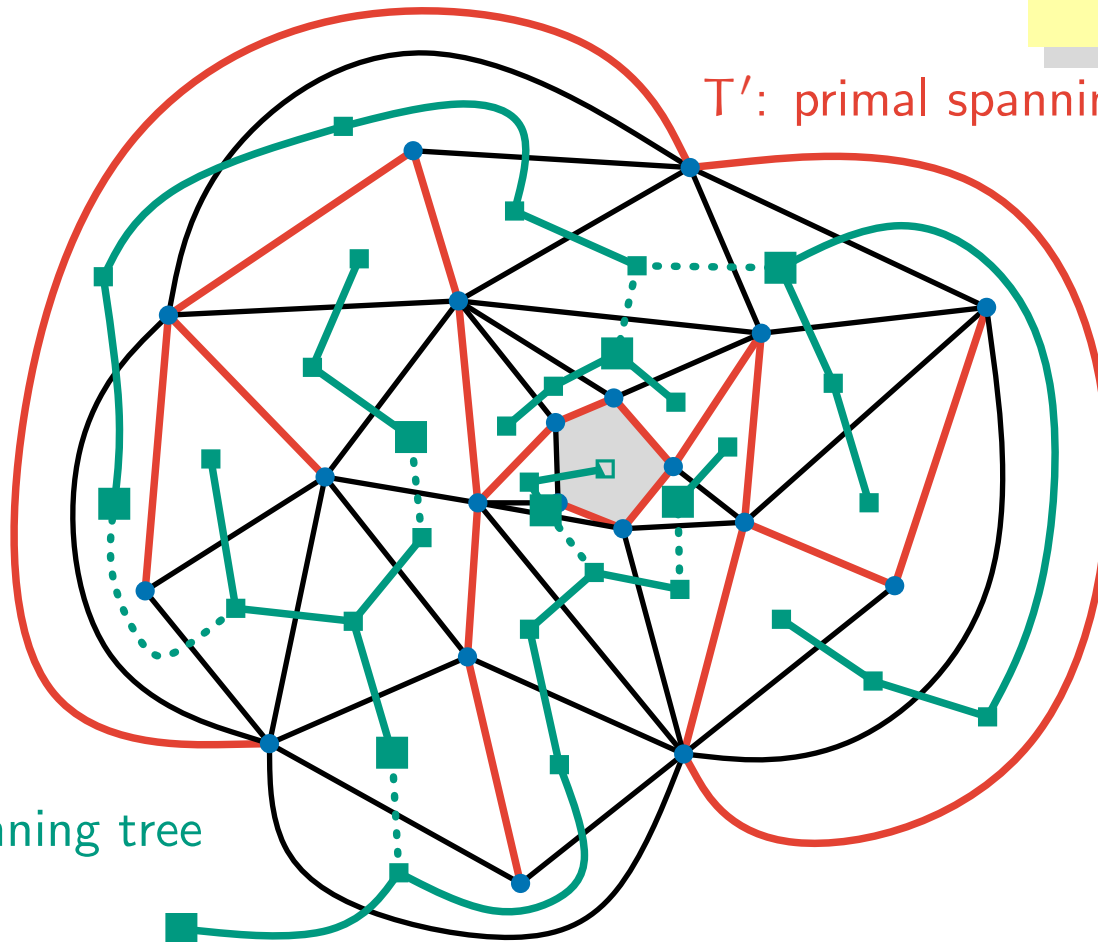
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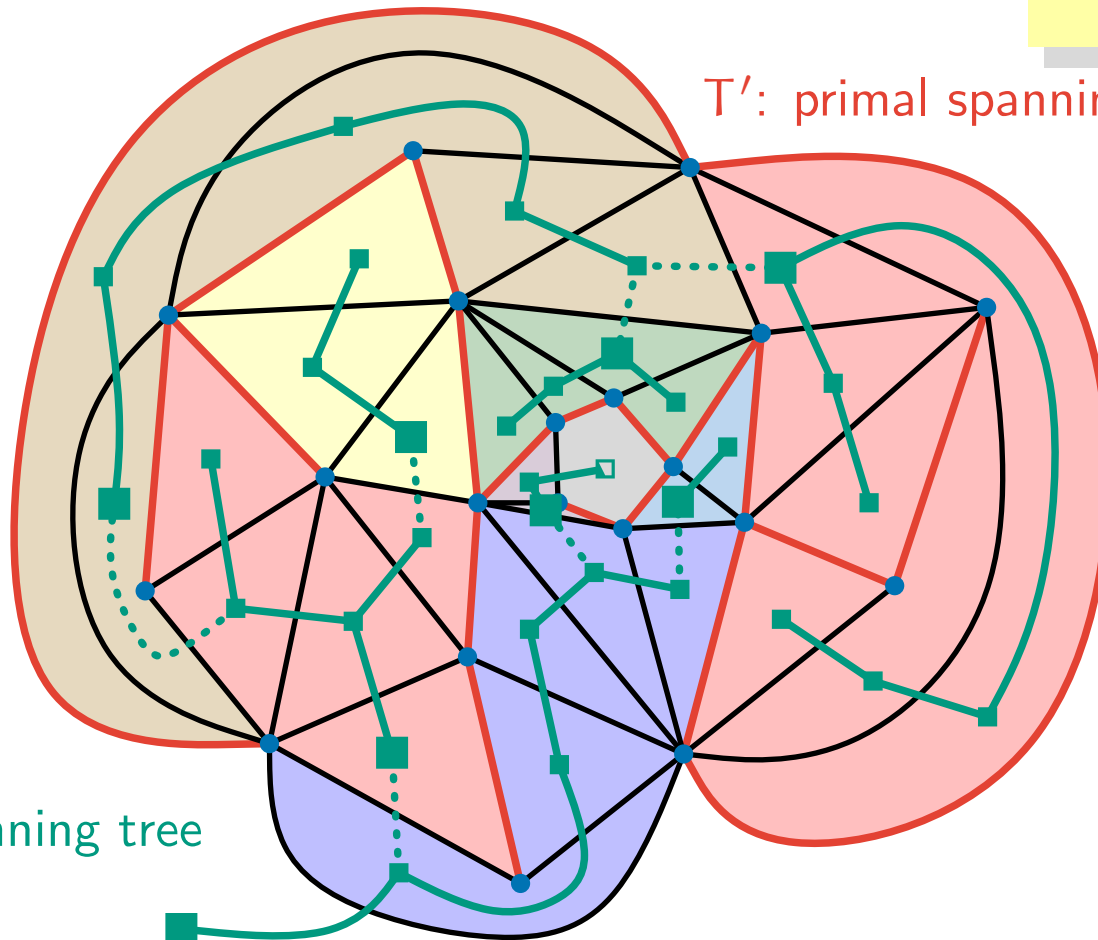
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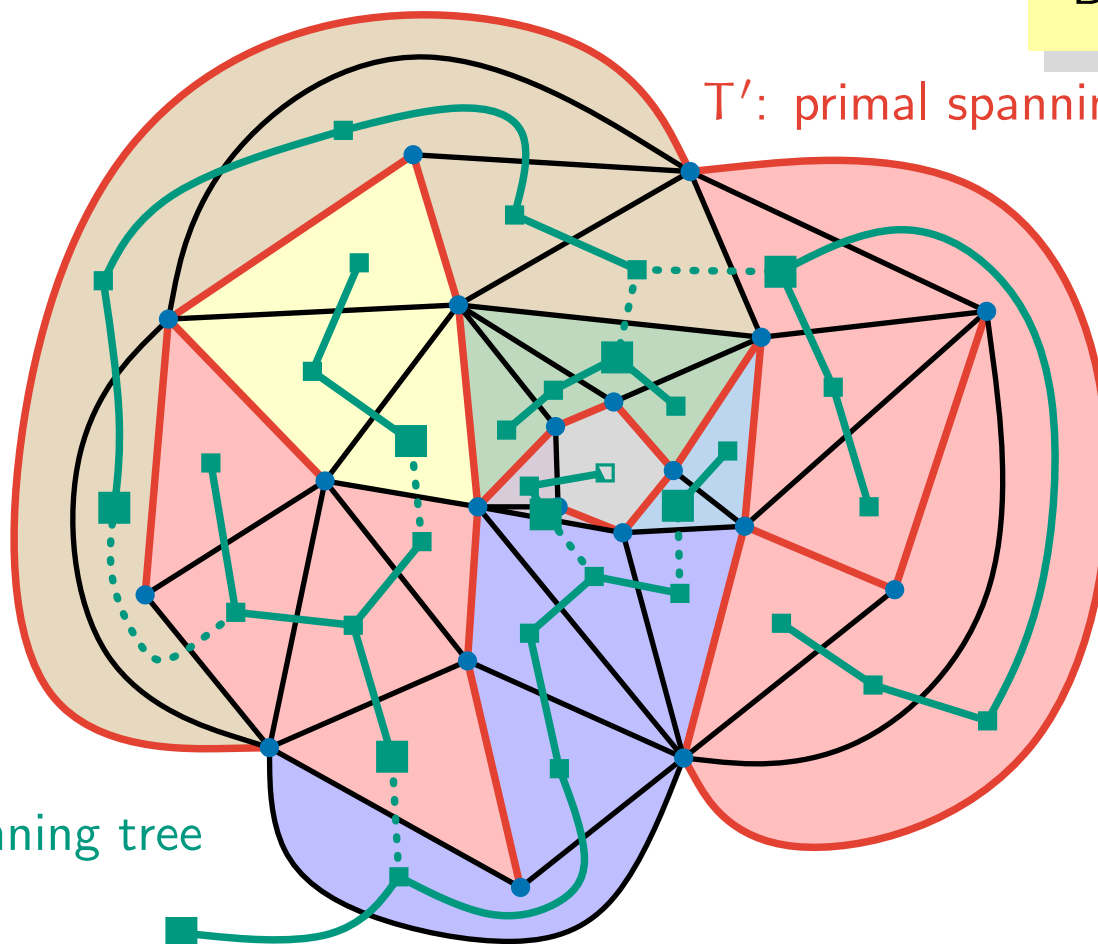
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Output Step 2.1:

Big regions, such that regions hanging off region roots are small

$T^*$ : dual spanning tree

# Multiway simple cycle separators

## Summary

- $O(N)$  time internal-memory algorithm
- I/O-efficient algorithm using  $O(\text{sort}(N))$  I/Os and  $O(N \log N)$  time
- Applications (same I/O and time bounds):
  - SSSP
  - Topsort DAGs
  - Strongly connected components

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## Bonus features, see paper

- Support vertex, edge, and face weights
- Support general 2-edge-connected graphs with max. face size  $s$  (boundary size  $\rightarrow O(\sqrt{\varepsilon s N})$ )

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**Thanks,  
that's it!**

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