

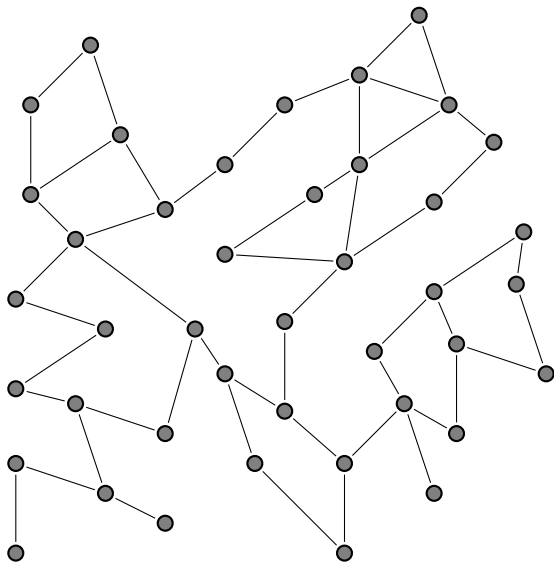
Fast and Stable Repartitioning of Road Networks

18th International Symposium on Experimental Algorithms

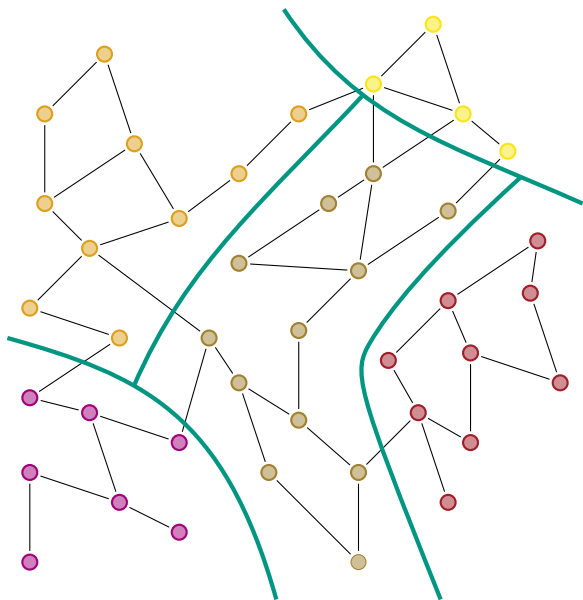
Valentin Buchhold Daniel Delling
Dennis Schieferdecker Michael Wegner

June 18, 2020

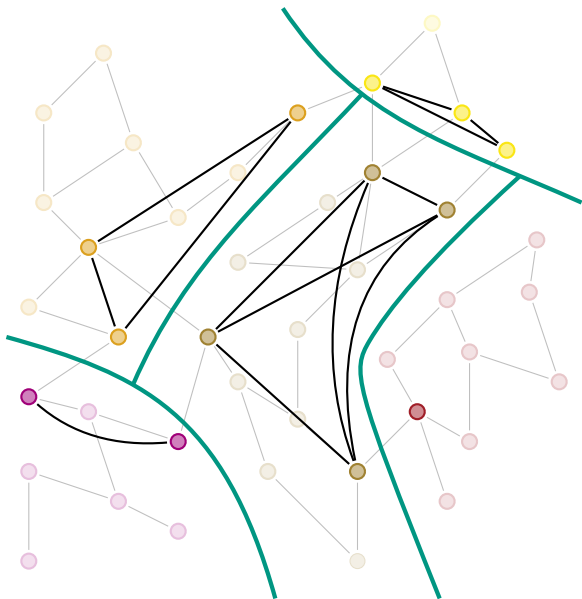
Partition-Based Route Planning



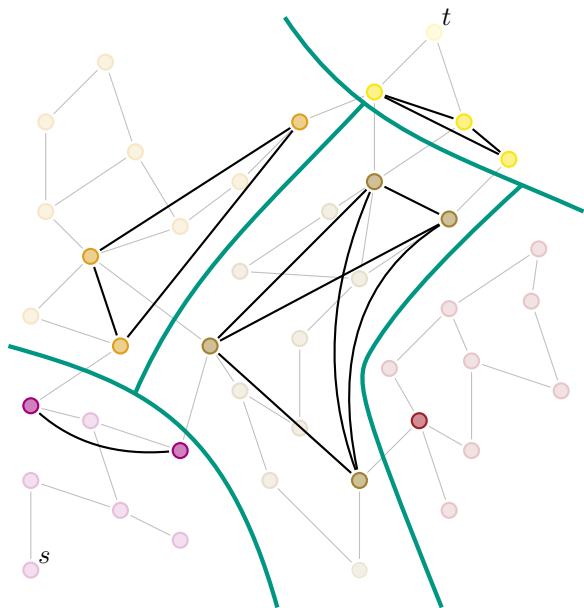
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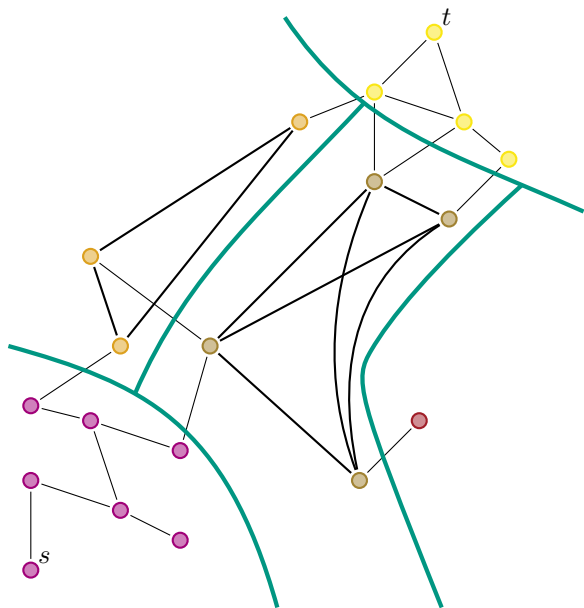
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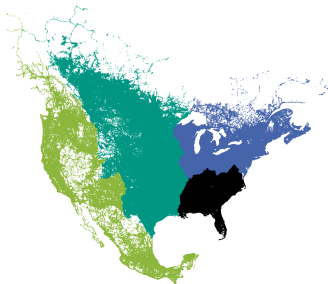
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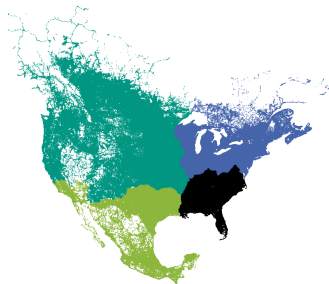
Real-World Production Systems

observations:

- ▶ data changes **continuously**
- ▶ OpenStreetMap: several million changes **each day**
- ▶ partitioning from scratch is **highly sensitive** to small changes



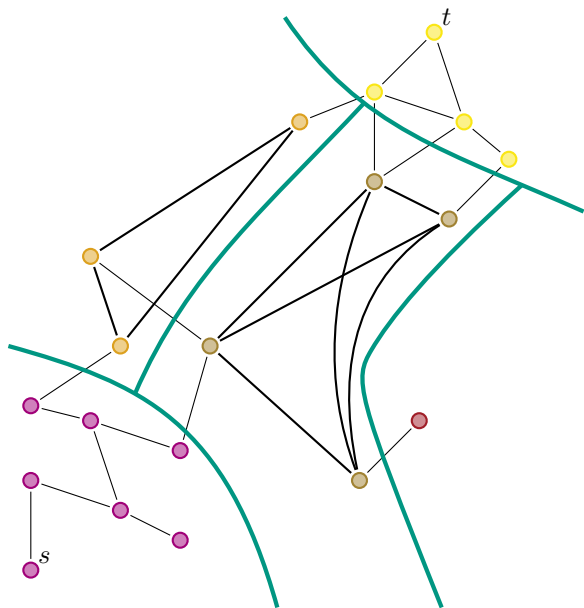
August 2018



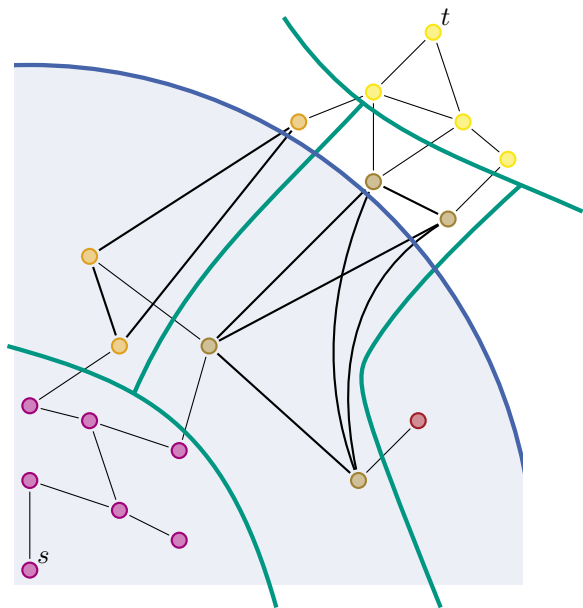
September 2018

change in vertices: 0.36 % are added, 0.21 % are removed

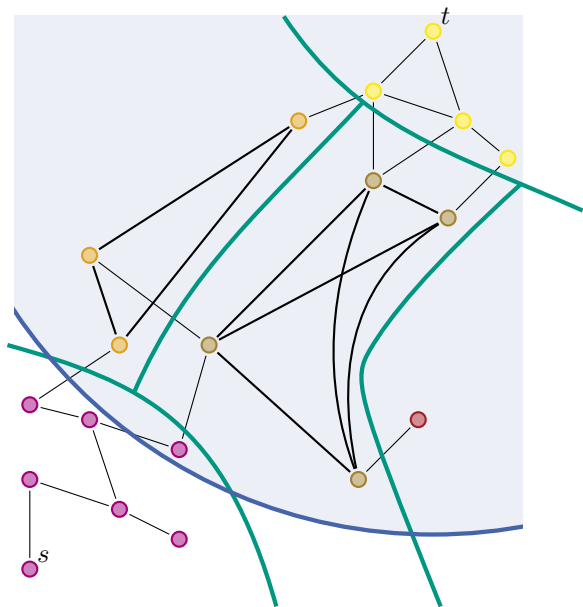
Computing Alternative Routes



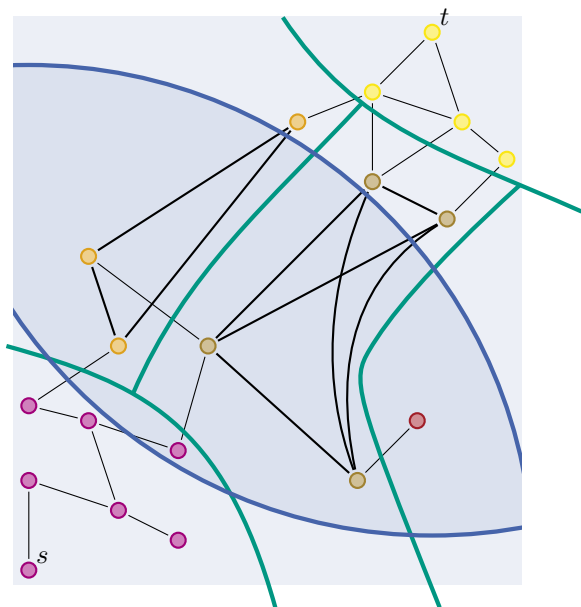
Computing Alternative Routes



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Computing Alternative Routes



Stable Graph Repartitioning

input:

- ▶ old graph
- ▶ new graph obtained from old one
by inserting and removing vertices and edges
- ▶ partition of old graph
into disjoint cells of roughly equal size

problem:

- ▶ cut new graph into disjoint **cells**
- ▶ of roughly equal size bounded by U
- ▶ while minimizing number of **cut edges**
- ▶ and maximizing **similarity** to old partition



Stable Graph Repartitioning

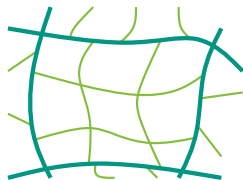
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⇒ we consider nested **multilevel** partitions



Related Work

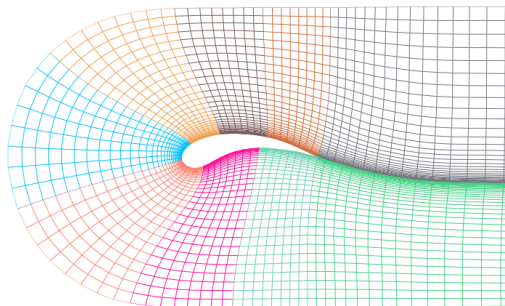
road network partitioning:

- ▶ PUNCH (2011)
- ▶ Buffoon (2012)
- ▶ Inertial Flow (2015)
- ▶ FlowCutter (2018)
- ▶ InertialFlowCutter (2019)

Related Work

road network partitioning:

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adaptive mesh repartitioning:

- ▶ scratch-remap repartitioners (1994, 1995, 1998, 2001)
 - ▶ diffusion-based repartitioners (1997, 1997, 2001)
 - ▶ unified repartitioning algorithm (2000)
- ⇒ new mesh obtained by **splitting** or **merging** vertices
- ⇒ most work considers a **fixed** topology
mesh refinements handled as vertex weight increases

Our Approach to Graph Repartitioning

idea:

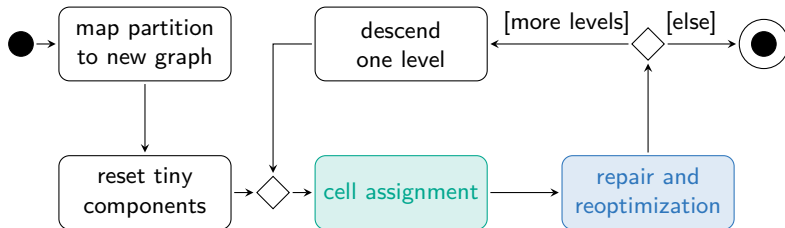
- ▶ start with previous partition
- ▶ incorporate new vertices (**cell assignment**)
- ▶ **repair and reoptimize** partition

Our Approach to Graph Repartitioning

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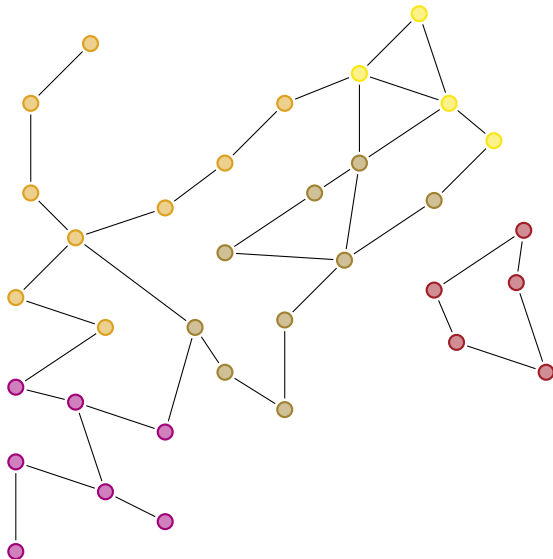
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process levels in top-down fashion:



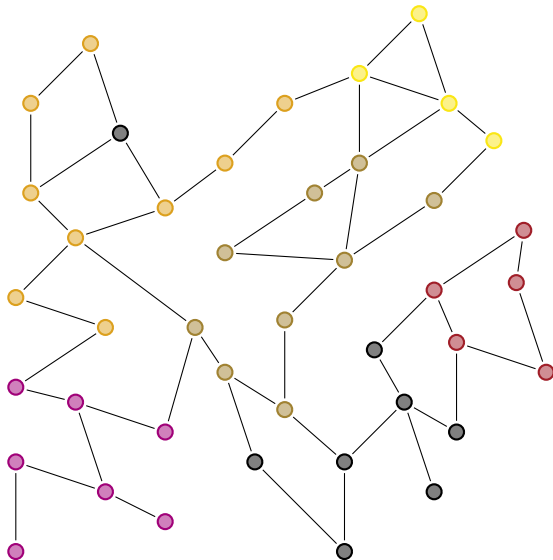
Cell Assignment

each new vertex chooses cell to which majority of its neighbors belong:



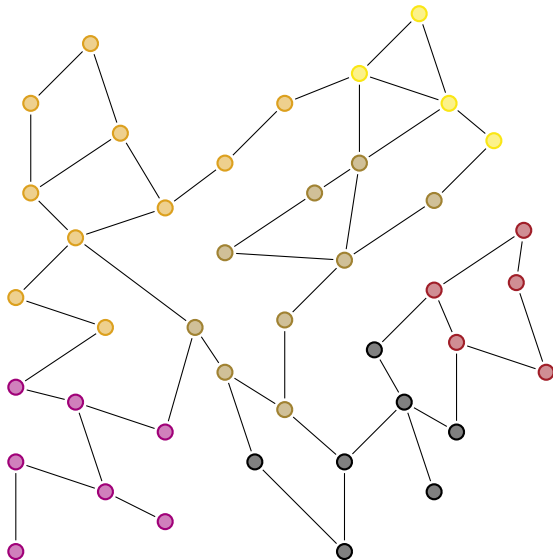
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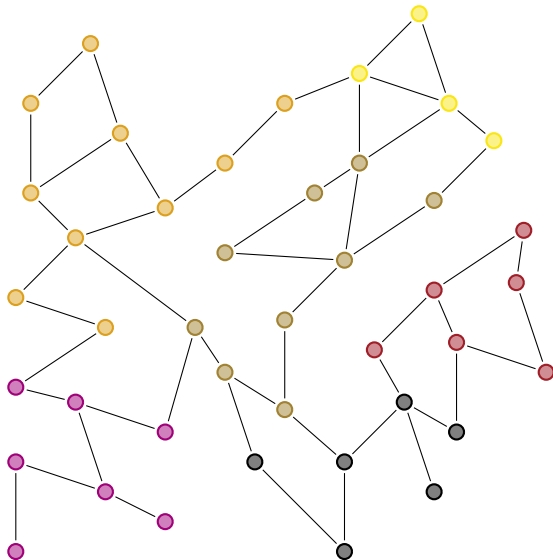
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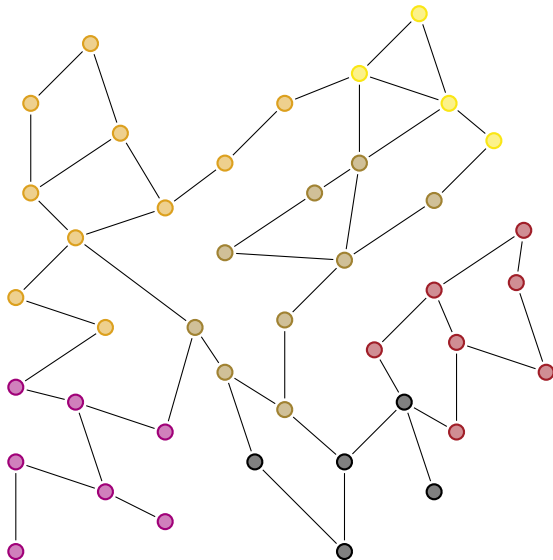
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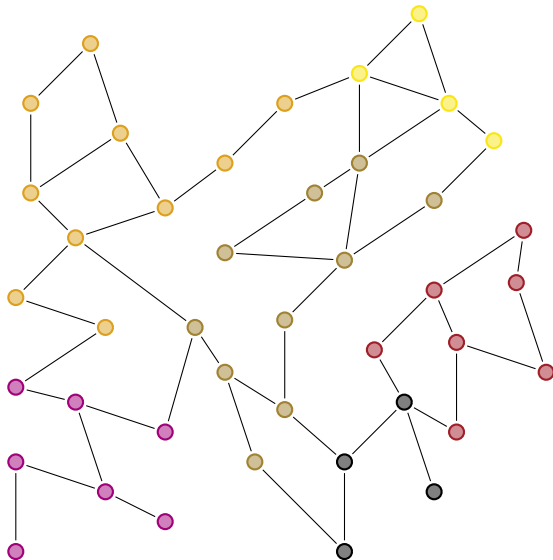
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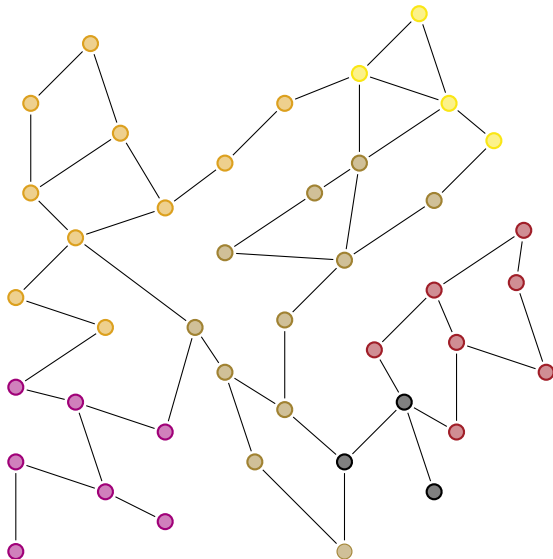
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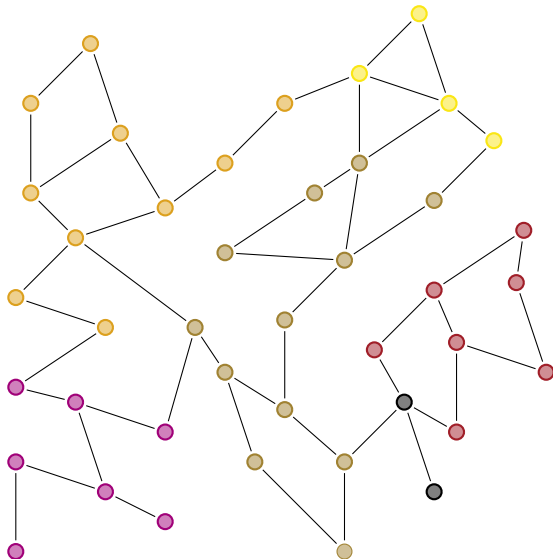
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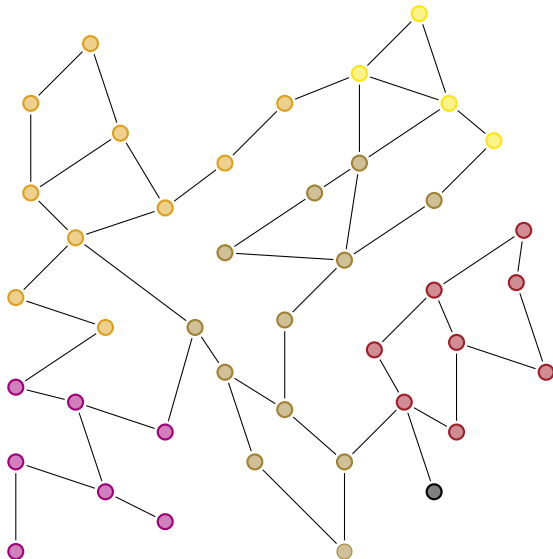
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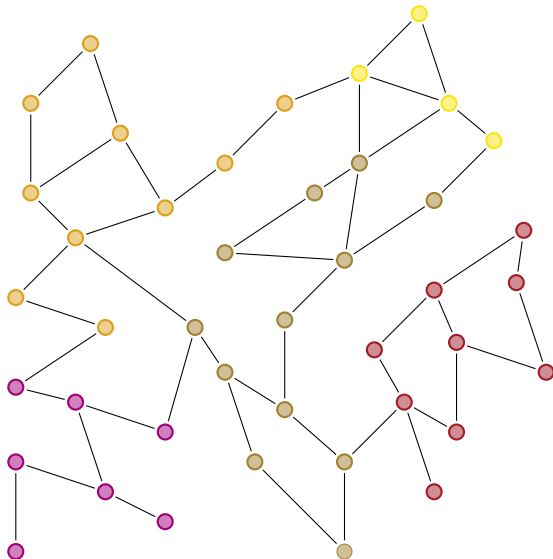
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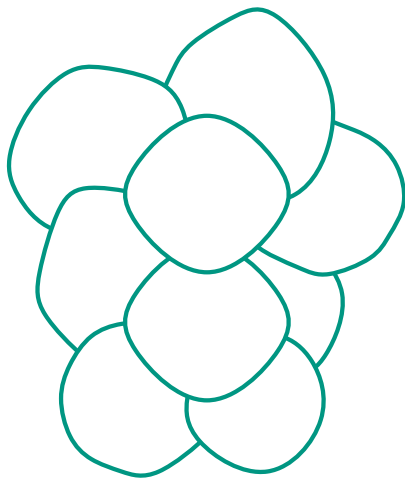
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Repair and Reoptimization

observations:

- ▶ some cells are **too large**
- ▶ some cells are **very small**

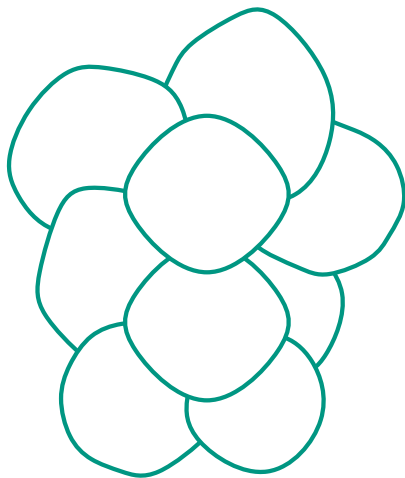


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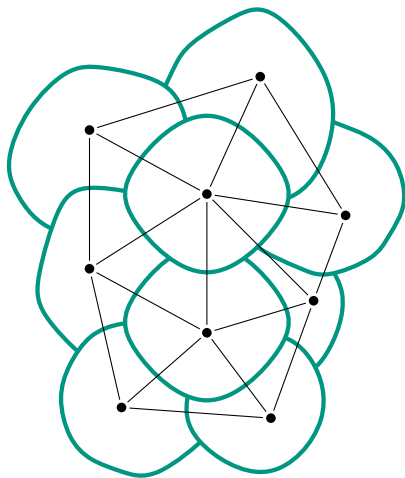
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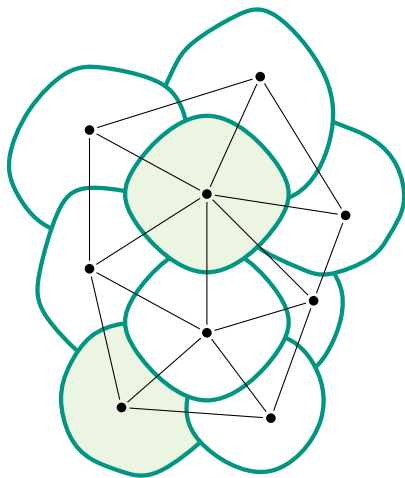
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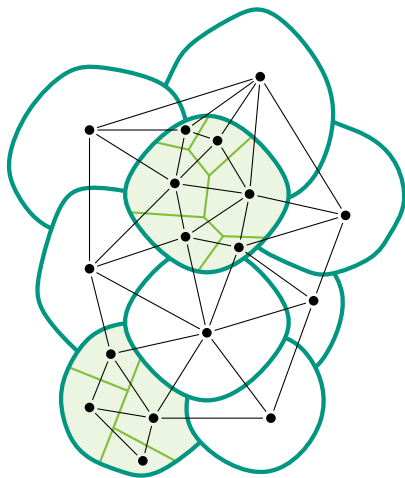
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2. **unpack** oversized cells



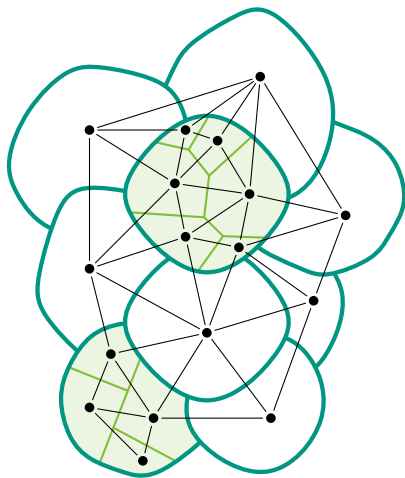
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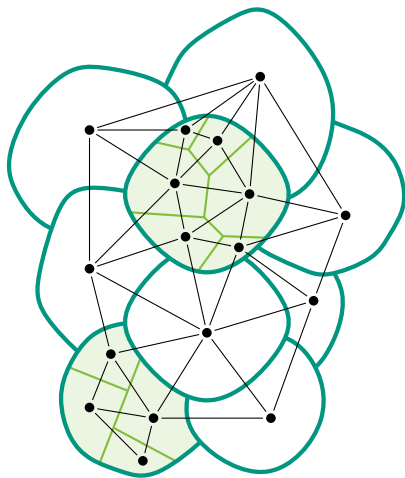
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Repair and Reoptimization

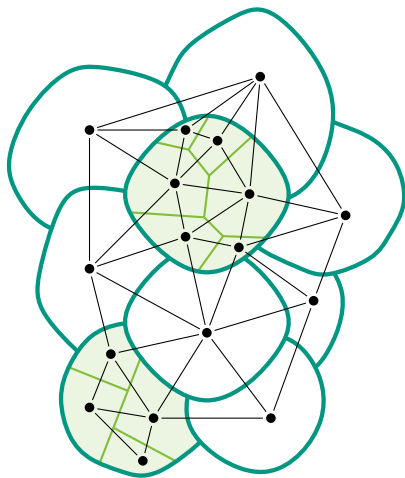
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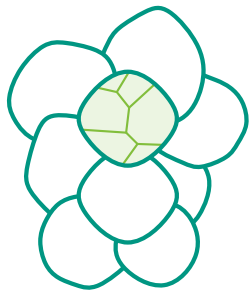
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⇒ **greedy algorithm and local search**
are subroutines from PUNCH



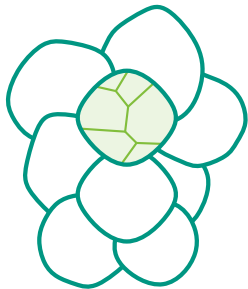
Cell Unpacking

simple unpacking:

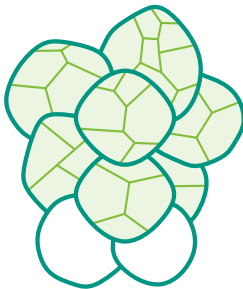


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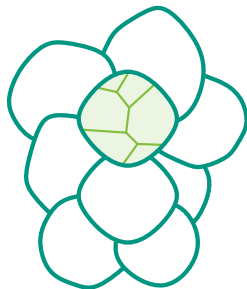


neighbor unpacking:

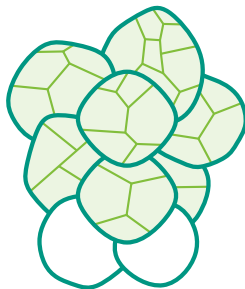


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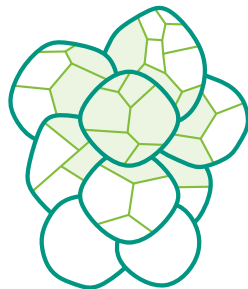
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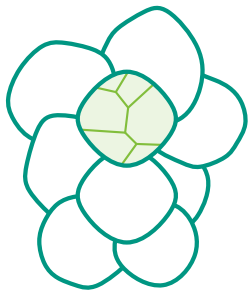


partial unpacking:

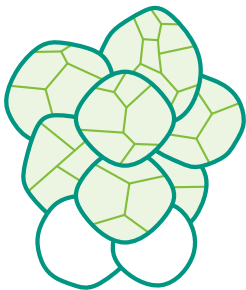


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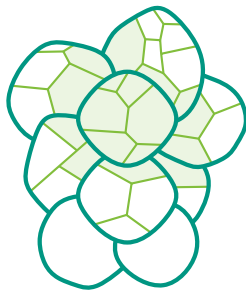
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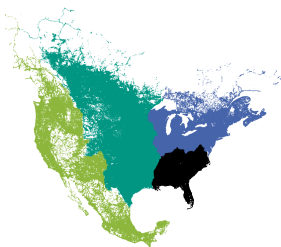


⇒ **simple unpacking yields good tradeoff between quality and similarity**

Experimental Evaluation

OSM North America:

- ▶ 25 million vertices
- ▶ **monthly** snapshots
- ▶ change in vertices: 0.36 % are added, 0.21 % are removed



August 2018
from scratch



September 2018
repartitioned

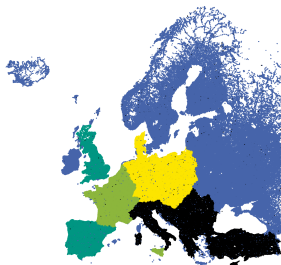


September 2018
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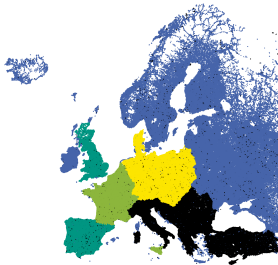
Experimental Evaluation

OSM Europe:

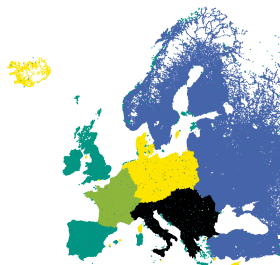
- ▶ 31 million vertices
- ▶ **yearly** snapshots
- ▶ change in vertices: 7.12% are modified



January 2018
from scratch



January 2019
repartitioned



January 2019
from scratch

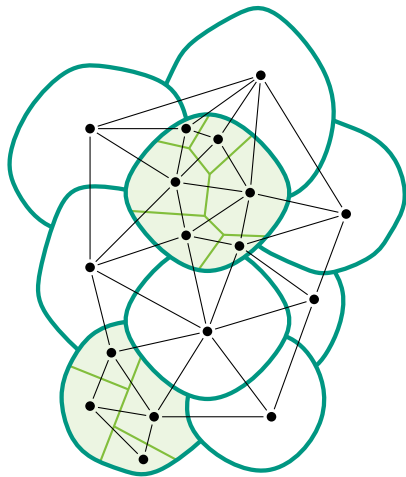
Experimental Evaluation

period	instance	cut [%]	similarity [%]				speedup
			lowest level		highest level		
			repair	full	repair	full	
mo	Australia	3.09	98.87	64.57	97.60	39.27	12.07
	N America	3.11	98.64	64.01	87.16	31.07	9.64
	Europe	3.24	98.35	62.70	94.70	50.73	9.35
yr	Australia	10.91	85.16	49.60	75.49	23.33	6.31
	N America	13.14	91.04	54.55	62.46	32.53	4.09
	Europe	12.83	90.41	52.98	73.64	46.03	7.48

Conclusion

summary:

- ▶ new **repartitioning** algorithm
- ▶ improves fraction of unchanged overlay vertices to more than 90 %
- ▶ accelerates network repartitioning by an order of magnitude
- ▶ cut size is only about 3 % higher



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future work:

- ▶ handle **larger** changes
- ▶ other classes of evolving networks

