

# High Quality (Hyper-)Graph Partitioning

Algorithm Engineering for NP-hard Graph Problems

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## 1. The $\epsilon$ -balanced (Hyper-)Graph Partitioning Problem

**Graph:**  $G = (V, E)$

- models **relationships** between **objects**
- dyadic (**2-ary**) relationships

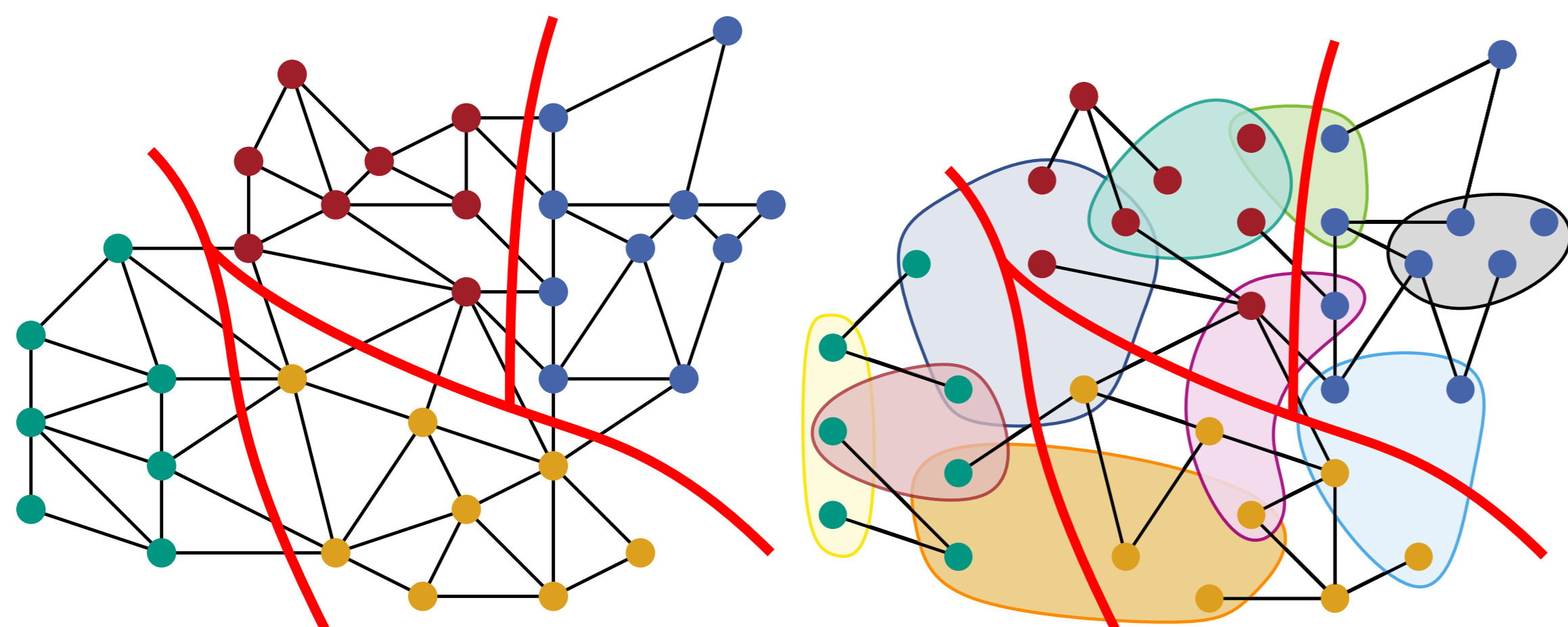
**Hypergraph:**  $H = (V, E)$

- generalization  $\Rightarrow$  edges connect  $\geq 2$  vertices
- arbitrary (**d-ary**) relationships

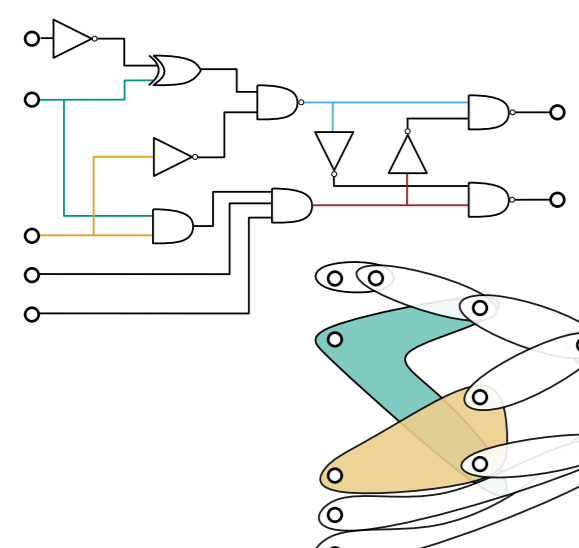
**Task:**

Partition  $G/H = (V, E, c : V \rightarrow \mathbb{R}_{>0}, \omega : E \rightarrow \mathbb{R}_{>0})$  into  $k$  disjoint blocks  $V_1, \dots, V_k$  such that

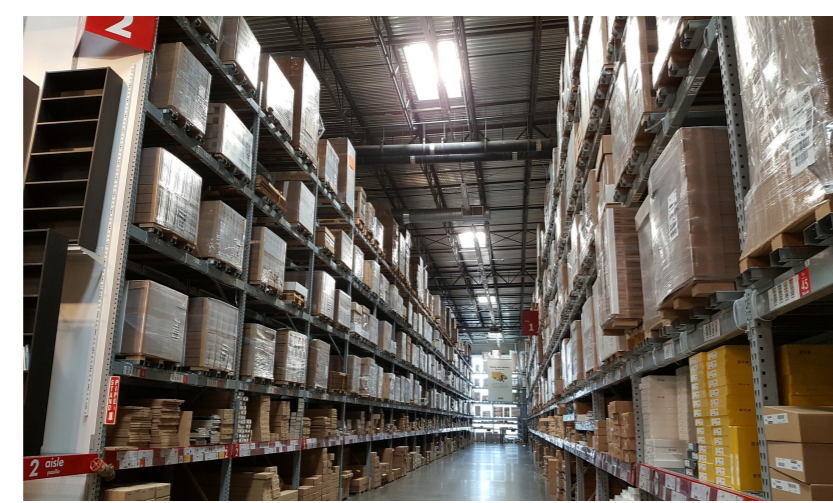
- blocks  $V_i$  are **roughly equal-sized**:  $c(V_i) \leq (1 + \epsilon) \left\lceil \frac{c(V)}{k} \right\rceil$
- objective** fct. on edges is **minimized**:  $\text{cut} = \sum_{e \in \text{cut}} \omega(e)$ ,  $\text{connectivity} = \sum_{e \in \text{cut}} (\lambda - 1) \omega(e)$ , where  $\lambda = \#$  blocks connected by edge  $e$



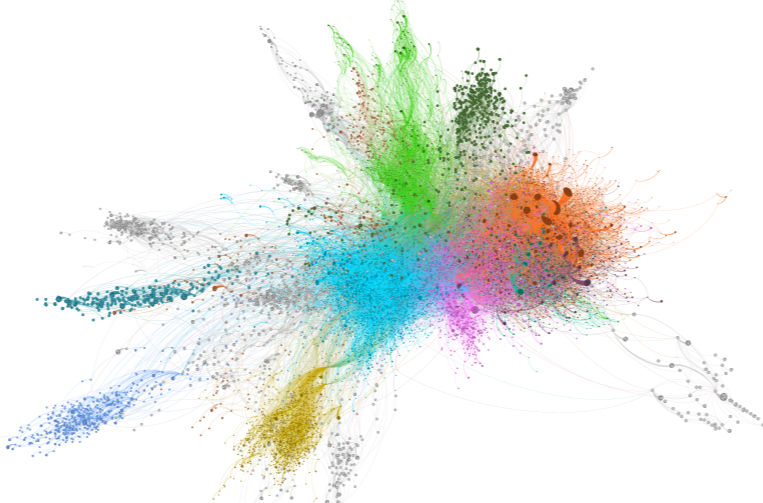
## 2. Applications



VLSI Design



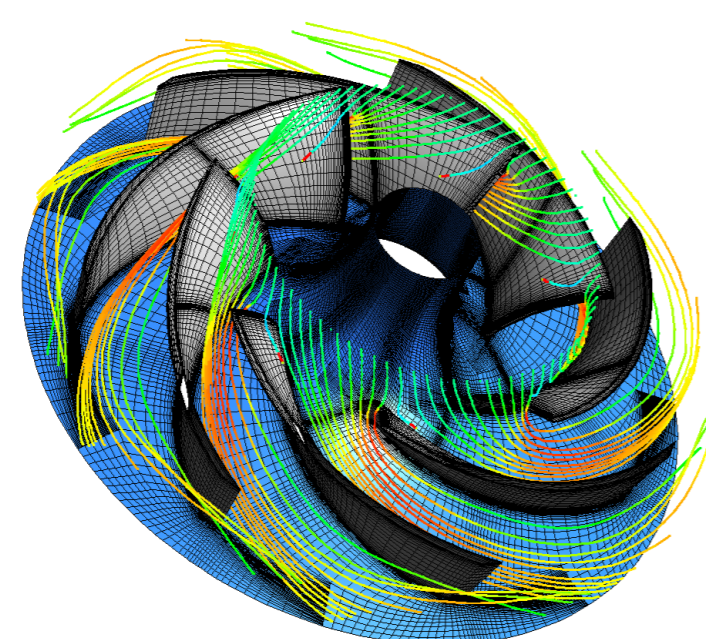
Warehouse Optimization



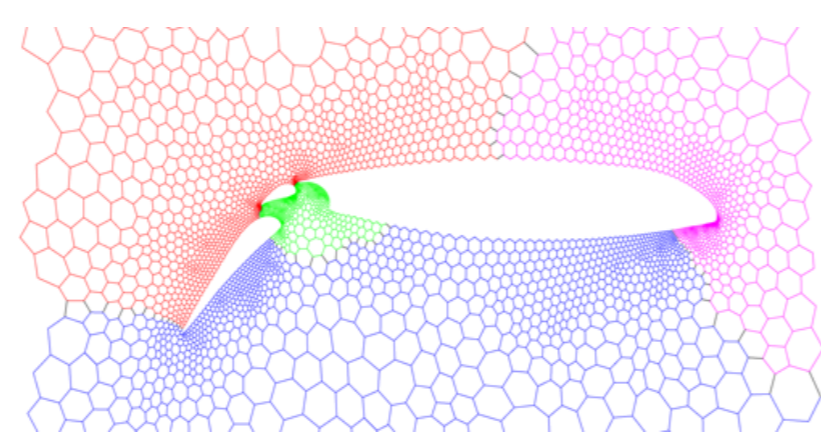
Complex Networks



Route Planning

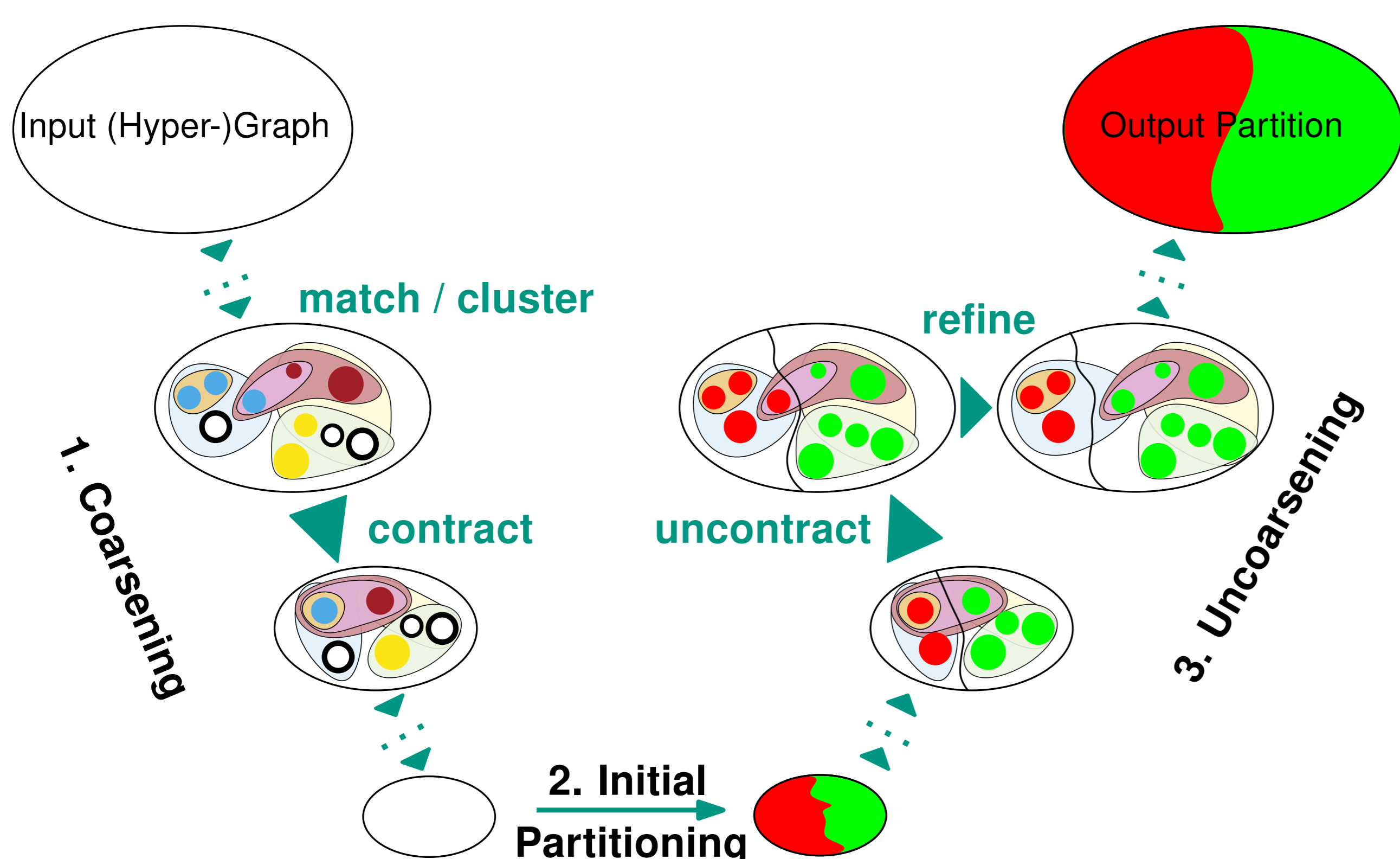


Simulation

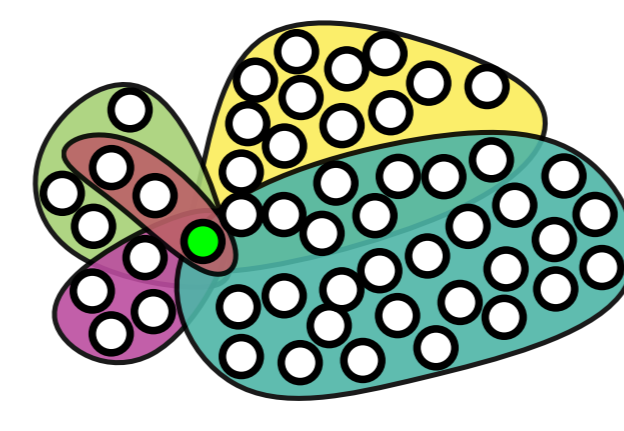


$\mathbb{R}^{n \times n} \ni Ax = b \in \mathbb{R}^n$   
Scientific Computing

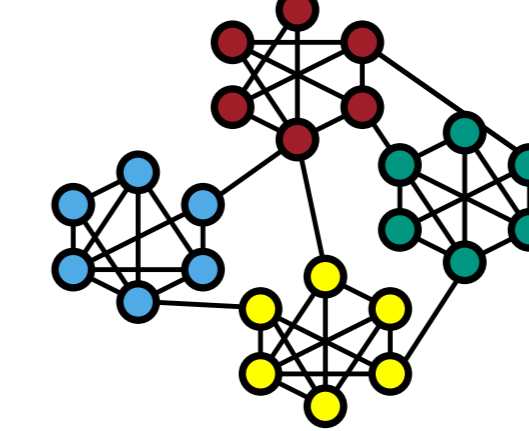
## 3. Multilevel (Hyper-)Graph Partitioning



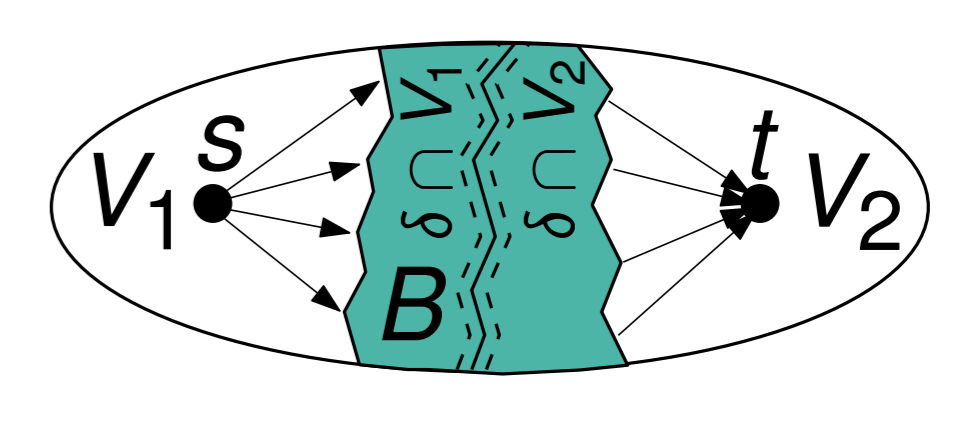
## 4. Algorithmic Innovations



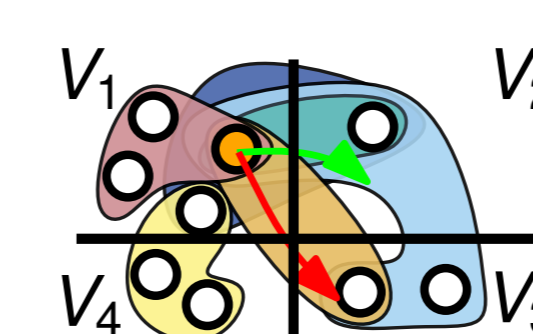
Min-Hash Based Sparsification



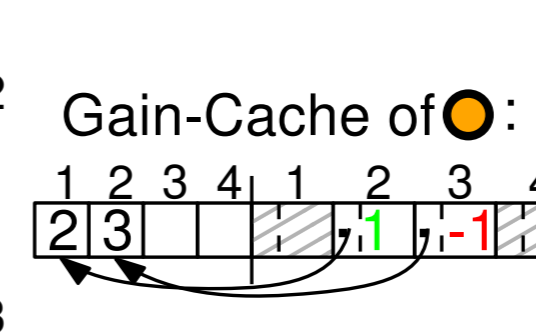
Community-Aware Coarsening



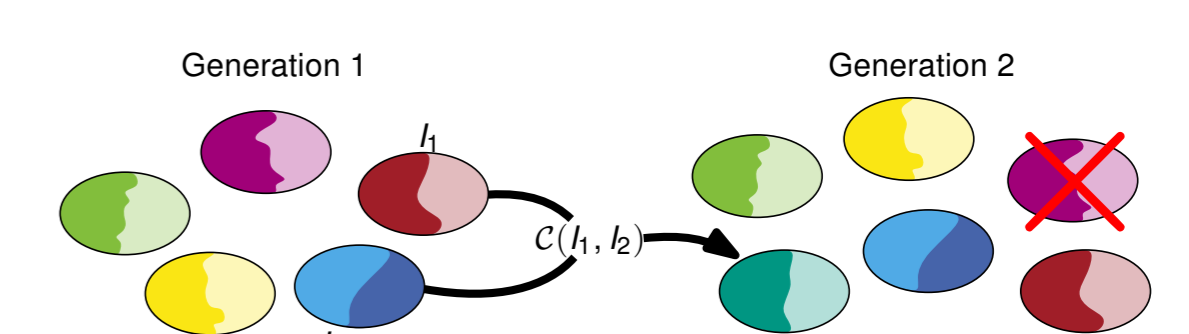
Max-Flow Min-Cut Refinement



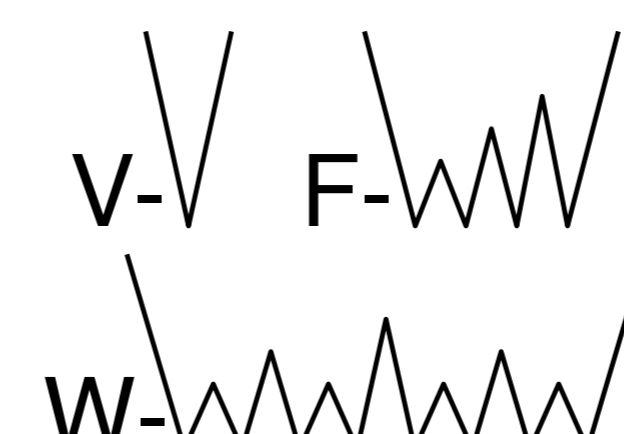
Engineered FM Local Search



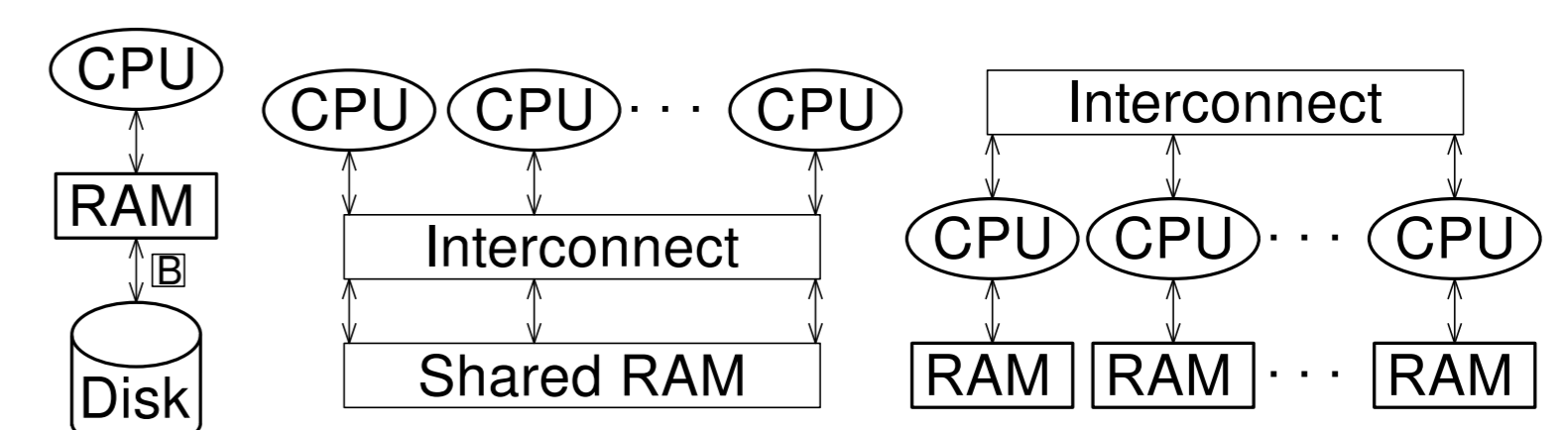
Gain-Cache of 0



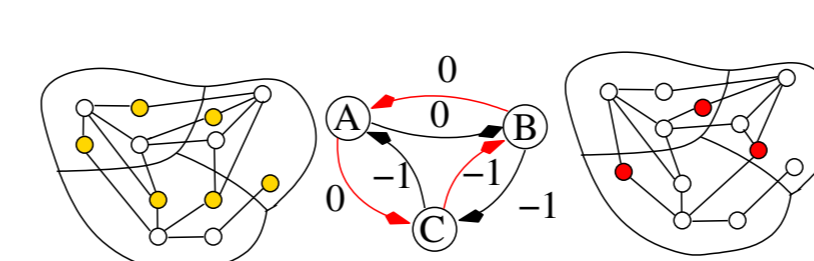
Evolutionary Algorithms



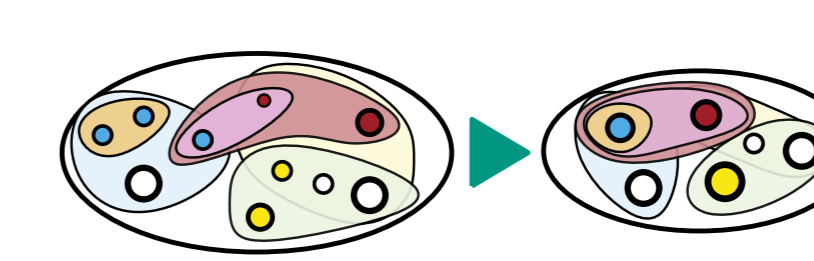
Global Search Strategies



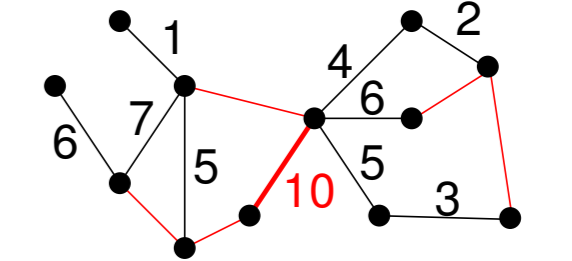
Advanced Memory Models / Parallelization



Negative Cycle Detection



Fast  $n$ -Level Coarsening



Approx. Weighted Matching

## 5. Open Source (Hyper-)Graph Partitioning Software

**KaHIP - Karlsruhe High Quality Partitioning:**

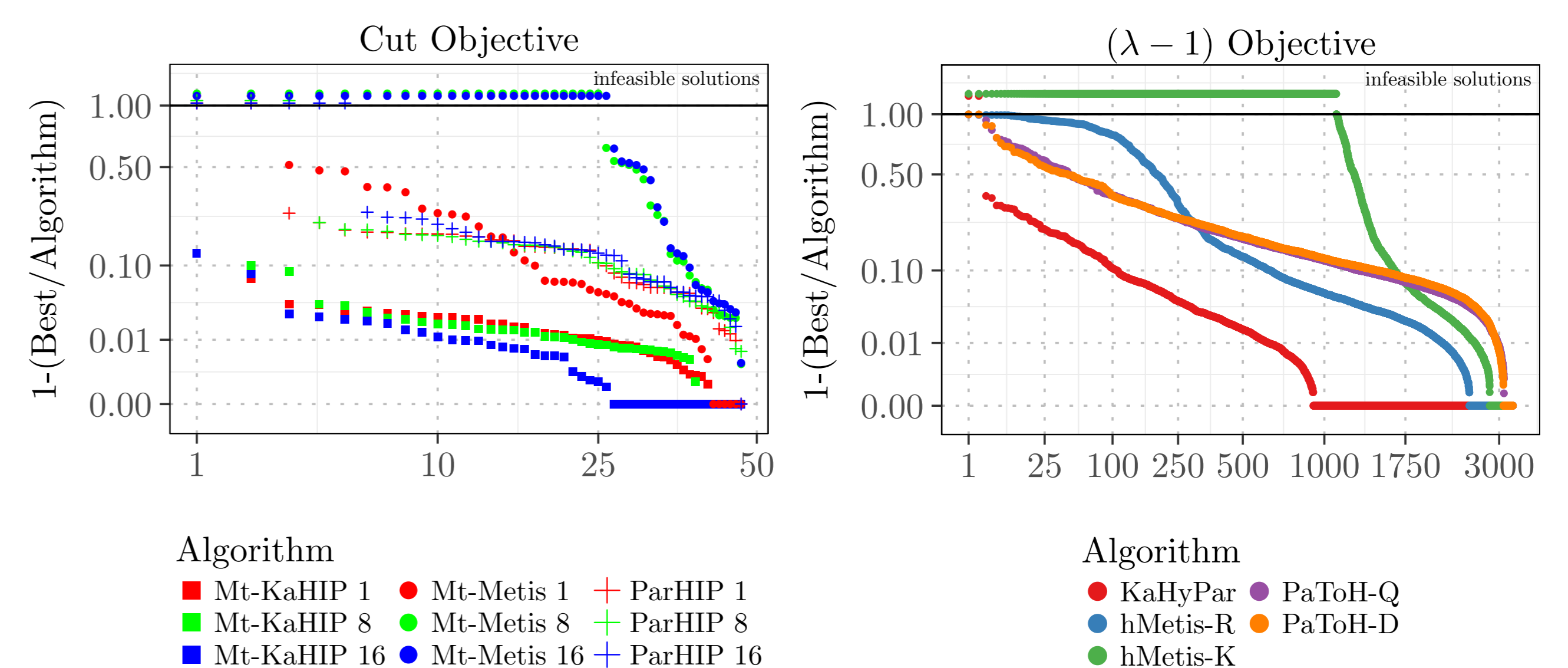
- <http://algo2.iti.kit.edu/kahip/>
- multilevel graph partitioning algorithms
- parallel evolutionary algorithm
- perfectly balanced partitioning

**KaHyPar - Karlsruhe Hypergraph Partitioning:**

- <http://www.kahypar.org>
- $n$ -Level approach
- cut and connectivity optimization
- recursive bisection & direct  $k$ -way

## 6. Experimental Results

Extensive experiments on large benchmark sets of graphs and hypergraphs confirm that KaHIP and KaHyPar compute high-quality solutions – outperforming competing state-of-the-art tools.



## Selected References

- [1] T. Heuer and **S. Schlag**. Improving Coarsening Schemes for Hypergraph Partitioning by Exploiting Community Structure. *SEA*, 2017.
- [2] P. Sanders and C. Schulz. Think Locally, Act Globally: Highly Balanced Graph Partitioning. *SEA*, 2013.

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