

Exact Algorithms for Finding Well-Connected 2-Clubs in Sparse Real-World Graphs: Theory and Experiments

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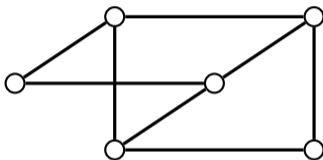
Shonan Meeting 144, March 5th

Based on joint work with Christian Komusiewicz, Rolf Niedermeier, and Marten Picker appearing in European Journal of Operational Research, 2019.

2-Club Problem

Input: An undirected graph $G = (V, E)$.

Task: Find the maximum size 2-club (= diameter-two subgraph) in G .



- ▶ proposed as clique relaxation in social network analysis [Mokken; Quality and Quantity, 1979]
- ▶ NP-hard [Balasundaram, Butenko, Trukhanov; Journal of Combinatorial Optimization, 2005]
- ▶ NP-hard to approximate within a factor $|V|^{1/2-\epsilon}$
[Asahiro, Doi, Miyano, Samizo, Shimizu; Algorithmica, 2018]

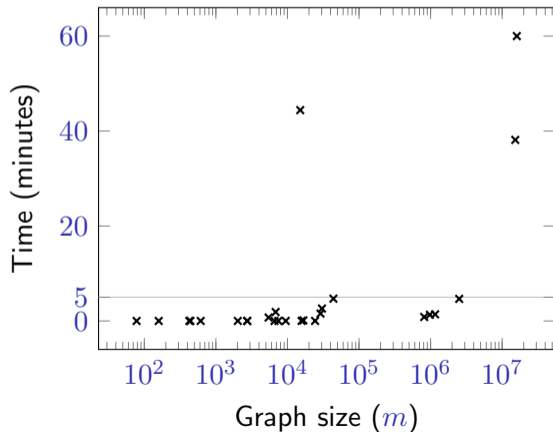
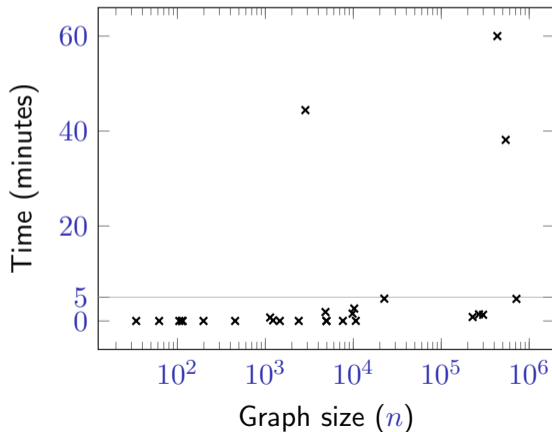
2-Club is hard? Not in practice!

Existing implementation: [Hartung, Komusiewicz, N.; Journal of Graph Algorithms and Applications, 2015]

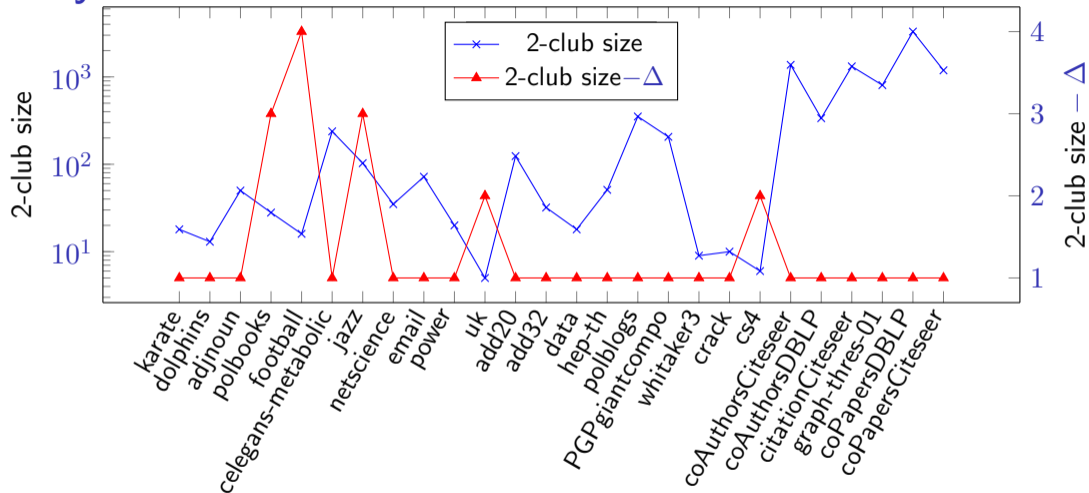
Data set: Graphs from **clustering** and **coauthor** category of the 10th DIMACS challenge

Implementation: Written in Java

Machine: CPU 3.60 GHz (Xeon); 64 GB main memory



Analysis: 2-Club size



↪ **Almost optimal algorithm:**

Return a maximum degree vertex with its neighbors

2-Club extensions

Definition ([Veremyev, Boginski; Eur J Oper Res, 2012])

t -robust 2-club G :

Any pair of vertices is connected by t internally vertex-disjoint paths of length at most two.

Definition ([Pattillo, Youssef, Butenko; Eur J Oper Res, 2013])

t -hereditary 2-club G :

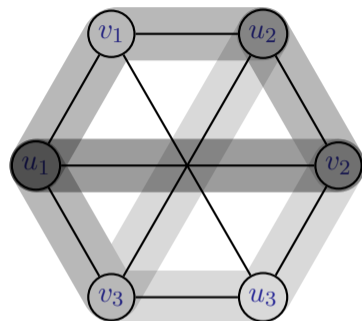
$G - U$ is a 2-club for all $U \subset V(G)$ where $|U| \leq t$.

\iff any pair of nonadjacent vertices has $t + 1$ common neighbors.

Definition ([Pattillo, Youssef, Butenko; Eur J Oper Res, 2013])

t -connected 2-club G :

G is a 2-club and t -vertex-connected.



Example: A $K_{3,3}$ is a

- ▶ 1-robust 2-club
- ▶ 2-hereditary 2-club
- ▶ 3-connected 2-club

Our results

Goal:

transfer algorithmic work (theoretical & practical) from **2-Club** to *t*-robust / *t*-hereditary / *t*-connected **2-Club**

Results:

- ▶ “unifying view” on all three considered models
- ▶ FPT algorithms
- ▶ competitive implementation

Simple search tree

Example: Find largest **2-hereditary 2-club**
(deleting any 2 vertices yields a **2-club**)

Observation: At most one red vertex in a solution.

Generic Search tree:

FindSolution(G)

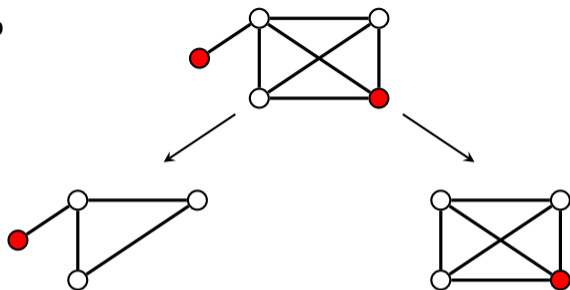
1. If G is a solution **then return G**
2. $u, v \leftarrow$ two **“incompatible”** vertices
3. **Return $\max\{\text{FindSolution}(G - v), \text{FindSolution}(G - u)\}$**

\rightsquigarrow running time $O(2^\ell nm)$

$\ell \dots$ number of vertices not in a solution

Note: no $2^{(1-\varepsilon)\ell} n^{O(1)}$ algorithm for any $\varepsilon > 0$, unless SETH fails

[Hartung, Komusiewicz, N.; Journal of Graph Algorithms and Applications, 2015]



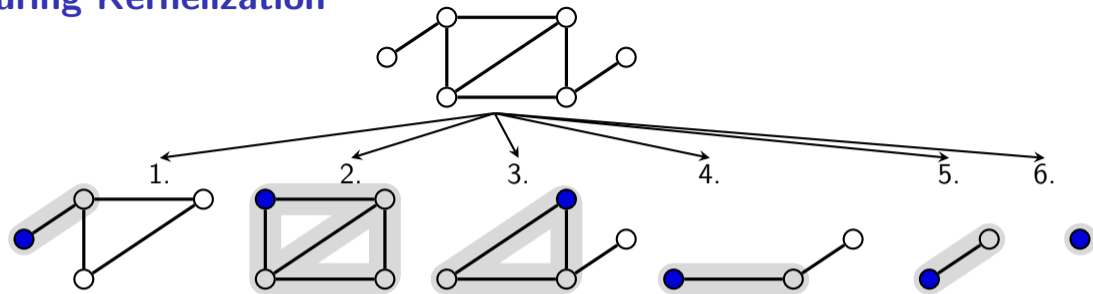
Compatible vertices — unifying view

Definition

Two vertices v and w in a graph are called **compatible**

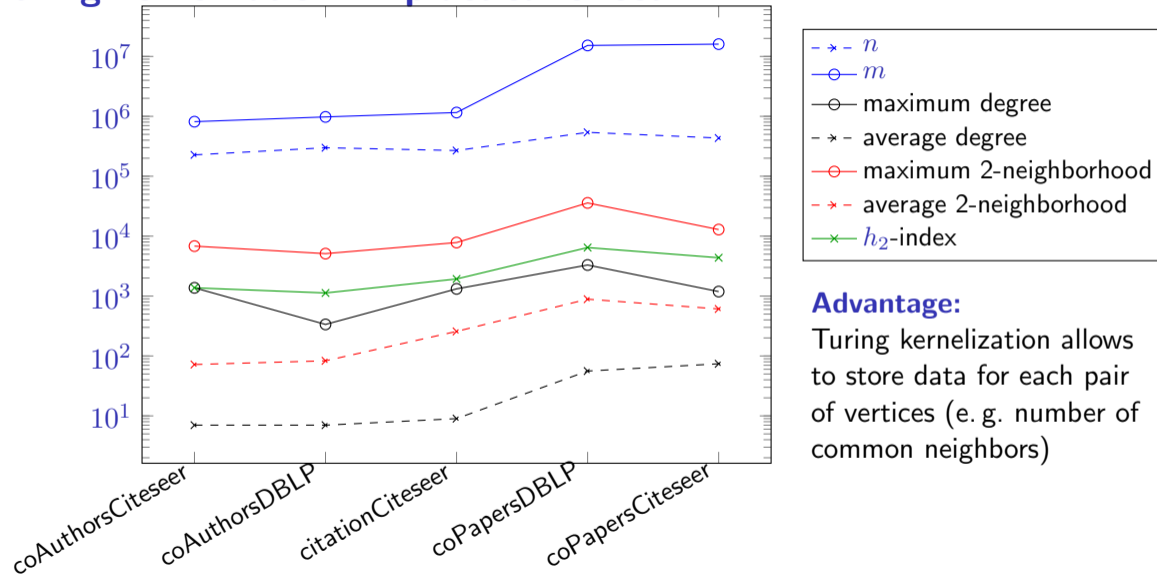
- ▶ for **t -robust 2-clubs** if they are adjacent and have at least $t - 1$ common neighbors, or if they have at least t common neighbors,
- ▶ for **t -hereditary 2-clubs** if they are adjacent or if they have at least $t + 1$ common neighbors,
- ▶ for **t -connected 2-clubs** if they are at distance at most two and are connected by at least t internally vertex-disjoint paths.

Turing Kernelization



1. $\text{sol} \leftarrow \emptyset$
2. **foreach** $v \in V$ **do**
3. $T \leftarrow$ all vertices at distance ≥ 2 from v
4. $S \leftarrow$ largest solution in T that contains v
5. **if** S is larger than sol **then** $\text{sol} \leftarrow S$
6. delete v
7. **return** sol

Turing kernelization — practical effect



Advantage:

Turing kernelization allows to store data for each pair of vertices (e. g. number of common neighbors)

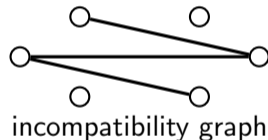
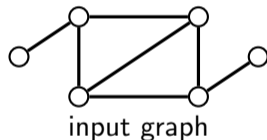
Data reduction & lower bounds

Reduction Rule

Remove vertices whose degree is too low.

Incompatibility graph:

Two vertices are adjacent in the the **incompatibility graph** iff they are not **compatible**.



Observation:

The size of a maximum **independent set** in the **incompatibility graph** is an upper bound on the **solution size** in the input graph.

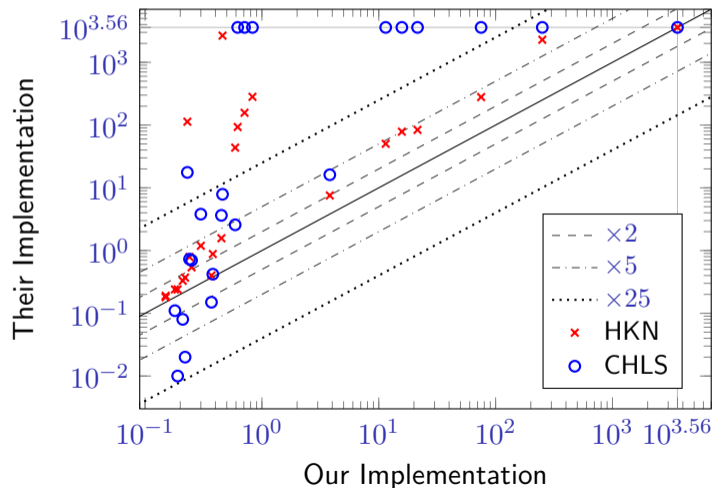
↪ upper bound worse than best previously found solution ⇒ discard current Turing kernel

Experiments I

Data set: Graphs from **clustering** and **coauthor** category of the 10th DIMACS challenge

Implementation: Written in Java

Machine: CPU 3.60 GHz (Xeon); 64 GB main memory



2-Club implementations:

► HKN (Java)

[Hartung, Komusiewicz, N.; Journal of Graph Algorithms and Applications, 2015]

► CHLS (c++)

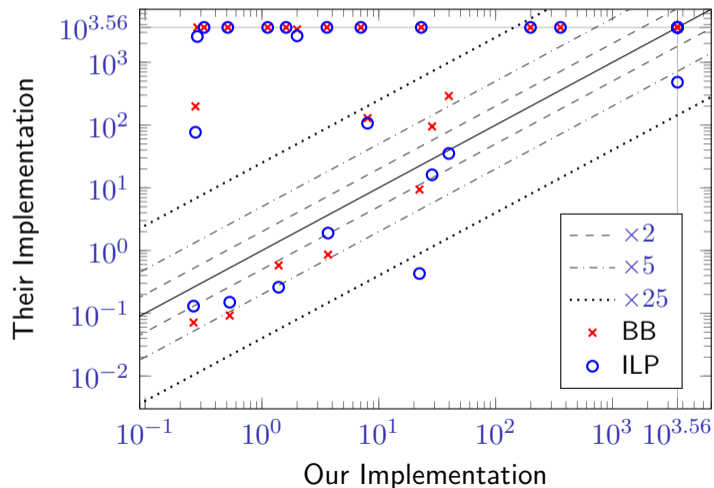
[Chang, Hung, Lin, Su; Computing, 2013.]

Experiments II

Data set: Graphs from **clustering** and **coauthor** category of the 10th DIMACS challenge

Implementation: Written in Java

Machine: CPU 3.60 GHz (Xeon); 64 GB main memory



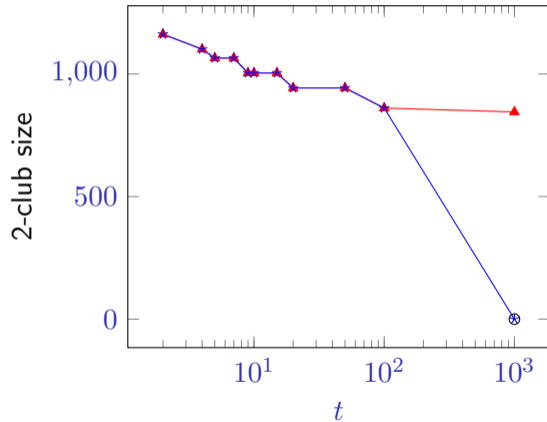
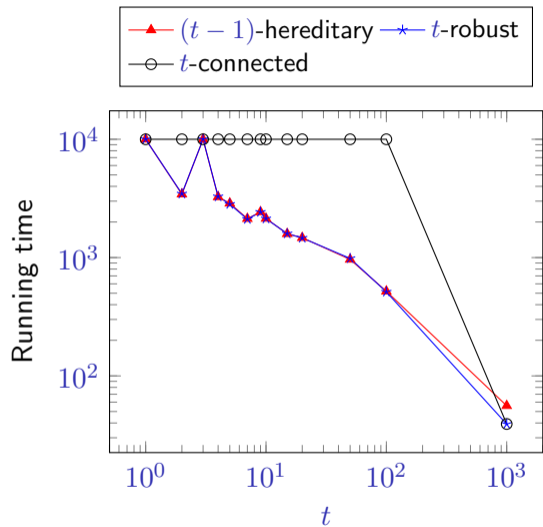
Implementations:

2-connected 2-Club

- ▶ **BB** - Branch & Bound (c++)
- ▶ **ILP** (c++ & Gurobi)

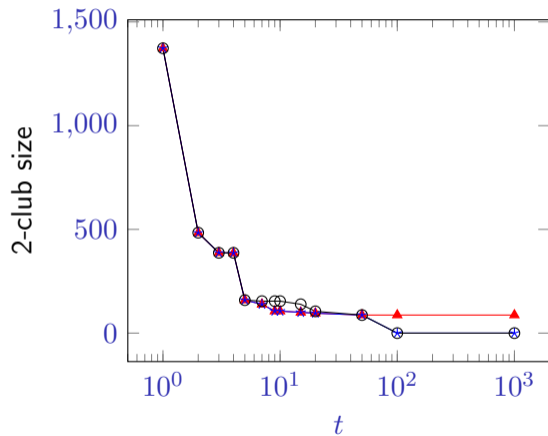
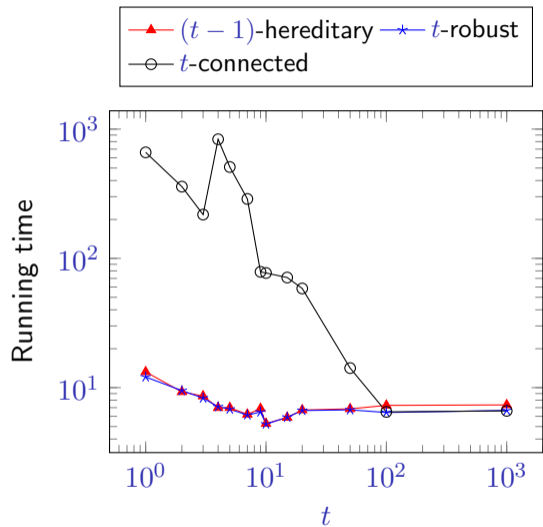
[Yezerka, Pajouh, Butenko; European
Journal of Operational Research, 2017.]

Experiments III



Graph: coPapersCiteSeer

Experiments IV



Graph: coAuthorsCiteseer

Summary & Outlook

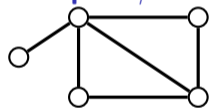
Key results:

- ▶ Unifying approach for several **2-club** variants.
- ▶ Efficient implementation (= data reduction + Turing kernelization + search tree).

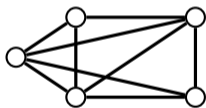
Work in progress: γ -relative robust 2-club S :

$0 < \gamma \leq 1$: Any pair of vertices connected by at least $\gamma \cdot |S|$ paths of length at most two.

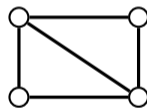
Example: $\gamma = 0.5$



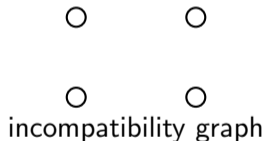
input graph



incompatibility graph



input graph



Open Question: Is t -robust / t -hereditary / t -connected 2-club fixed parameter tractable with respect to the solution size?

Thank you!