

Greedy Selfish Network Creation

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- Researcher at the “Institut für Informatik, Friedrich-Schiller-Universität (Jena)”.
- *On Selfish Network Creation*.
Dissertation, Humboldt-University Berlin, 2014.



Outline

- 1 Introduction
- 2 Tree Networks in SUM-GE
- 3 *Non-tree* Networks in SUM-GE
- 4 Concluding remarks



Models and definitions



Motivations

- Computing a best response strategy of an agent in the network creation game: NP-hard ([Fabrikant *et al.* 2003]).
- Internet Service Providers (ISPs) prefer **greedy** refinements of their current strategy over **radical re-design** of the infrastructure.



Network Creation Games (NCG)

- A set of n agents V .
- The price of buying an edge: $\alpha > 0$.
- $S_v \subseteq V \setminus \{v\}$: the strategy of agent v .
- G : the induced network.

The sum model

$$c_v(G, \alpha) = \alpha |S_v| + \sum_{w \in V(G)} d_G(v, w).$$

- The total cost is $c(G, \alpha) = \sum_{v \in V(G)} c_v(G, \alpha)$.



- The considered operations for an agent to improve her current strategy:
 - ① *greedy augmentation*: creating **one** new own link;
 - ② *greedy deletion*: removing **one** own link;
 - ③ *greedy swap*: swapping of **one** own link.
- ★ Computing the best greedy strategy refinement for one agent:
 - $O(n^2(n + m))$ time.



A useful property

Lemma 1

In the SUM network creation game:

Agent v can NOT decrease her cost by buying **one** edge
 \Rightarrow buying $k > 1$ edges can NOT decrease agent v 's cost.



Proof of Lemma 1:

- Assume that agent v :
 - owns q edges in (G, α) ;
 - can strictly decrease her cost by purchasing $k > 1$ edges e_1, \dots, e_k ;
 - $(G, \alpha) \xrightarrow{\text{augmented by } e_1, \dots, e_k} (G^k, \alpha)$.
 - has distance-cost D & D^k in (G, α) & (G^k, α) , resp.
- $c_v(G^k, \alpha) < c_v(G, \alpha) \Rightarrow k\alpha < D - D^k$.
 - $c_v(G, \alpha) = q\alpha + D$ and $c_v(G^k, \alpha) = q\alpha + k\alpha + D^k$.
- (G^{1^*}, α) : agent v has built the best possible additional edge e^* .
 - $c_v(G^{1^*}, \alpha) = q\alpha + \alpha + D^{1^*} \geq c_v(G, \alpha)$.



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- g^e : the decrease in distance cost for agent v if only the edge $e \in \{e_1, \dots, e_k, e^*\}$ is inserted into (G, α) .

- $k\alpha < D - D^k \Rightarrow \alpha < \frac{D - D^k}{k} \leq \frac{g^{e_1} + g^{e_2} + \dots + g^{e_k}}{k}$.

- Yet $g^{e_j} \leq g^{e^*}$.

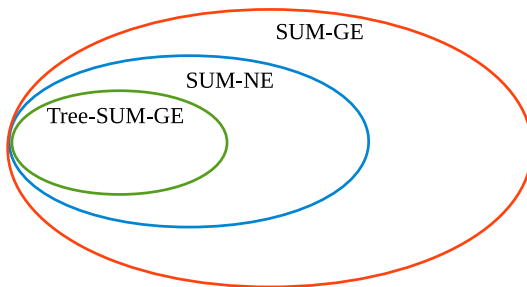
Tree Networks in SUM Greedy Equilibria



SUM-GE \subseteq SUM-NE

Theorem 2

$(G, \alpha) \in \text{SUM-GE}$ and G is a tree $\Rightarrow (G, \alpha) \in \text{SUM-NE}$.

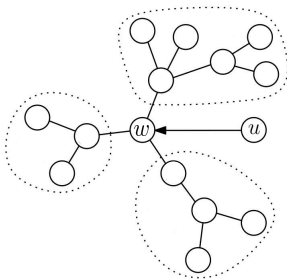


1-median [Kariv & Hakimi 1979]

$$\arg \min_{u \in V(G)} \sum_{w \in V(G)} d_G(u, w).$$

Lemma 2

Let (T, α) be a tree network in SUM-GE. If agent u owns edge $\{u, w\}$ in (T, α) , then w must be a 1-median of its tree in the forest $T - \{u\}$.

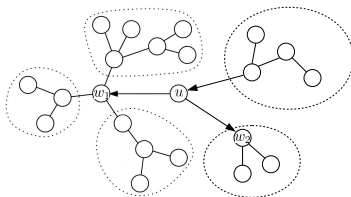


Corollary 1

Let $(T, \alpha) \in \text{SUM-GE}$, and let

- T^u : the forest induced by removing all edges owned by u ;
- F^u : T^u withOUT the tree containing u .

Then agent u 's strategy in (T, α) is the **optimal** strategy among all strategies that *buy exactly one edge into each tree of F^u* .

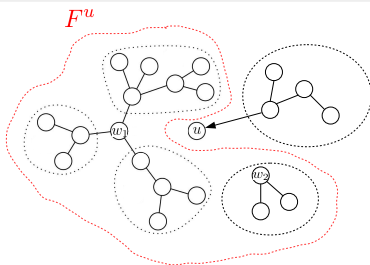


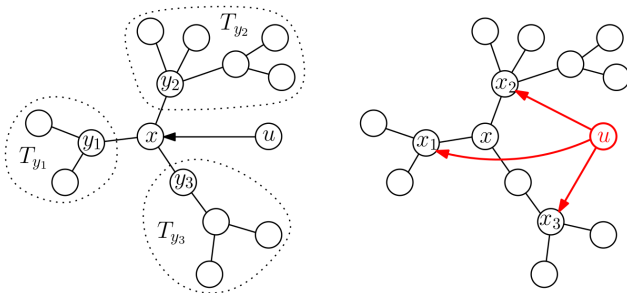
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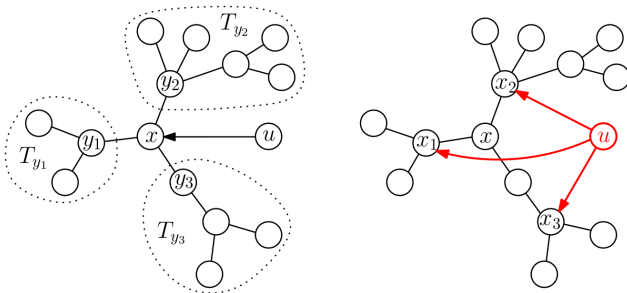
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- $x \in V(T)$: 1-median of T .
- (G_T^u, α) : obtained by adding u and inserting edge $\{u, x\}$, where $u \notin V(T)$.
- y_1, \dots, y_ℓ : the neighbors of x in T .
- T_{y_i} : the maximal subtree of T rooted at y_i (withOUT x).
- $S^* = \{x_1, \dots, x_k\}$: the best strategy of u buying ≥ 2 edges.





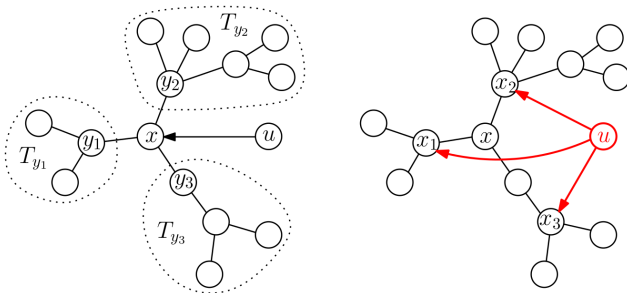
Lemma 3

There is no subtree T_{y_i} , for $1 \leq i \leq \ell$, which contains ALL vertices x_1, \dots, x_k .

Key observation [Kariv & Hakimi 1979]

$x \in V(T)$ is a 1-median of tree T iff $|V(T_{y_i})| \leq n/2$ for all i .





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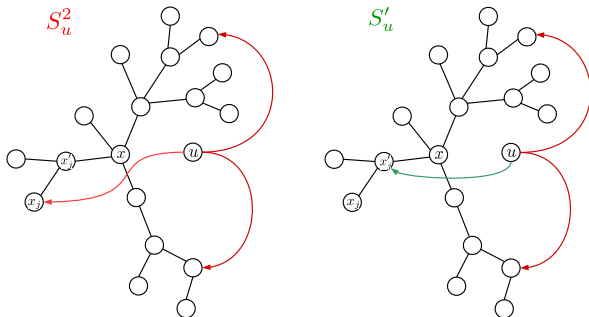


- ★ S_u^1 : agent u 's best strategy that buys ≥ 2 edges including one edge towards x .
- ★ S_u^2 : agent u 's best strategy that buys ≥ 2 edges, but none of them towards x .

Lemma 4

Let $x_j := \arg \min_{v \in S_u^2} d_T(v, x)$.

If S_u^2 yields less cost for agent u than strategy S_u^1 , then x_j can NOT be a leaf of G_T^u .

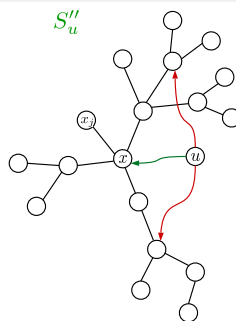
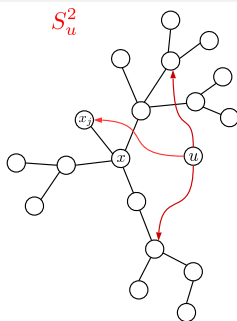


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Proof of Theorem 2

Theorem 2

$(G, \alpha) \in \text{SUM-GE}$ and G is a tree $\Rightarrow (G, \alpha) \in \text{SUM-NE}$.

We show that:

- an agent u can decrease her cost by a strategy-change in $(T, \alpha) \in \text{SUM-GE}$
 $\Rightarrow \exists$ an agent z who can decrease her cost by a **greedy** strategy-change.

Assume that u cannot decrease her cost by a greedy strategy-change, but by an arbitrary one.

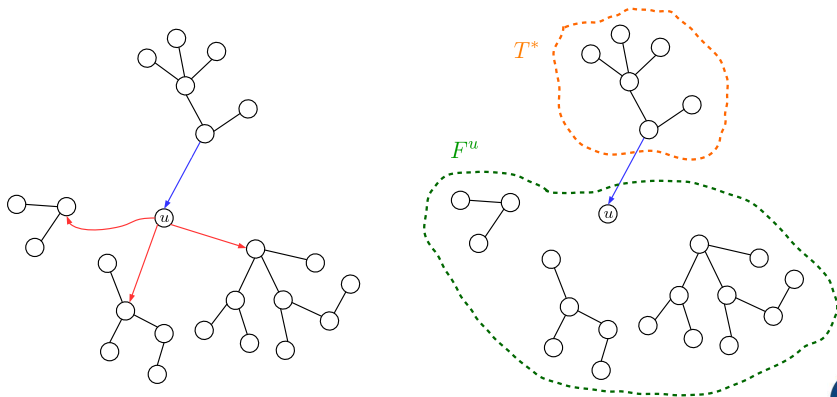


Proof of Theorem 2 (contd.)

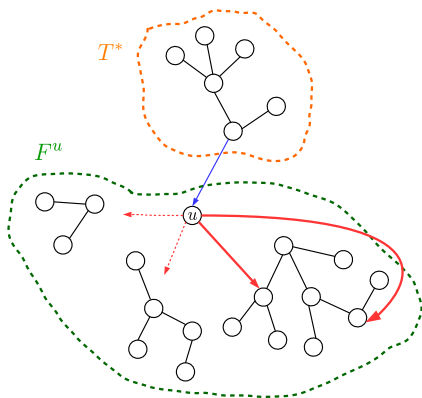
- S^* : u 's best possible *arbitrary* strategy.
 - Choose the one which buys the least number of edges.
- The only way u can possibly decrease her cost:
removing j owned edges and building k edges simultaneously
($k > j$ by Corollary 1).
 - u can NOT remove any owned edge withOUT purchasing edges.
 - u can NOT decrease her cost by purchasing $k > 0$ *additional* edges.



Proof of Theorem 2 (contd.)



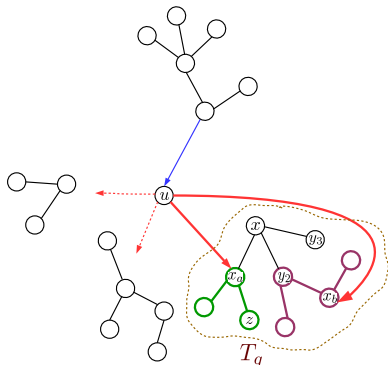
Proof of Theorem 2 (contd.)



- Among the k new edges, none of them has an endpoint in T^* (by Lemma 1).
- Removing $j = 3$ owned edges and building $k = 4$ edges of u simultaneously...
- By the pigeonhole principle, there must be a tree T_q in F^u where u buys ≥ 2 edges with strategy S^* .



Proof of Theorem 2 (contd.)

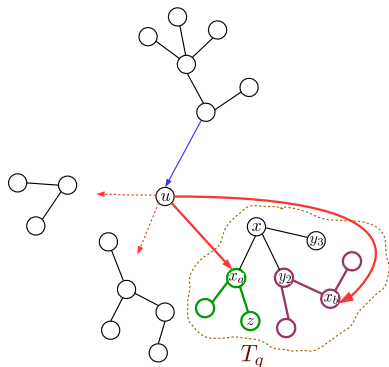


- $x \in V(T_q)$: u has a unique edge $\{u, x\}$ of T connecting u to T_q .
- x_a : the new strategy of u which has minimum distance to x .
- By Lemma 3, $\exists x_b$ located at a different subtree (say rooted at y_2) different from the one where x_a is.
- x_a must not be a leaf node (by Lemma 4).
- $\exists z$, a neighbor of x_a :

$$d_T(z, x) > d_T(x_a, x).$$
- z can buy the edge $\{z, x_0\}$ (imitating what u does)



Proof of Theorem 2 (contd.)



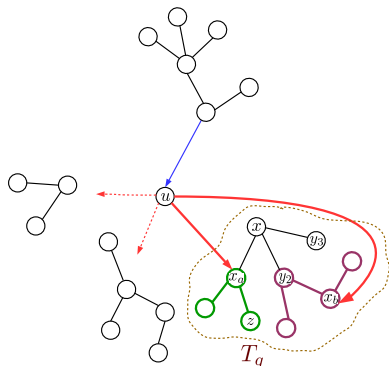
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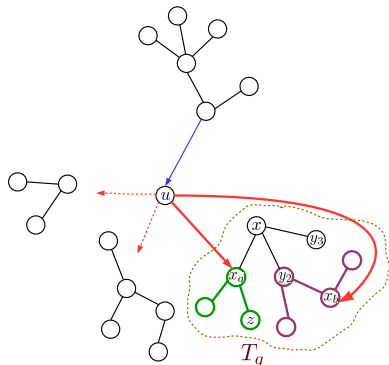


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Non-Tree Networks in SUM Greedy Equilibria

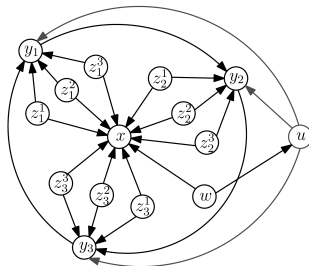


The negative result

Theorem 3

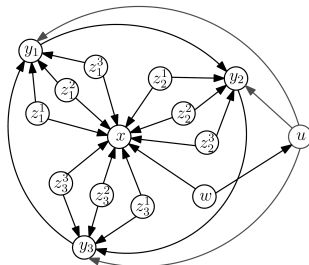
There is a network in SUM-GE which is NOT in β -approximate SUM-NE for $\beta < \frac{3}{2}$.





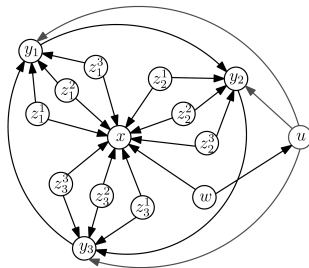
- A special family of graphs $\{G_k \mid k = 1, 2, \dots\}$.
 - $V(G_k) = \{u, w, x, y_1, \dots, y_k\} \cup \{z_i^j \mid 1 \leq i, j \leq k\}$;
 - u owns edges towards y_1, \dots, y_k ;
 - w owns edges towards x and u ;
 - each z_i^j owns an edge to x and y_i ;
 - y_1, \dots, y_k form a clique (edge-ownership: arbitrary).
- First, we show that $(G_k, k+1) \in \text{SUM-GE}$.





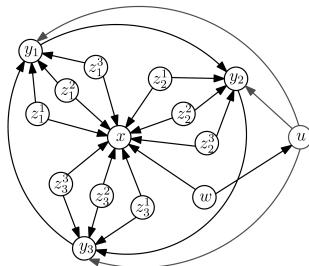
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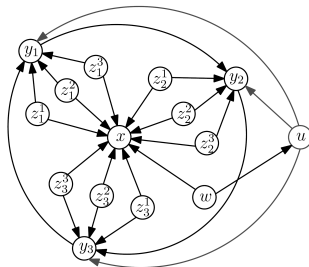
- No agent can **buy** an edge to decrease her cost.
 - G_k has diameter 2 & $\alpha = k + 1 > 1$.
- **Swapping** any own edge cannot decrease one's cost either.
 - The number of neighbors stays the same.
- How about edge removals?





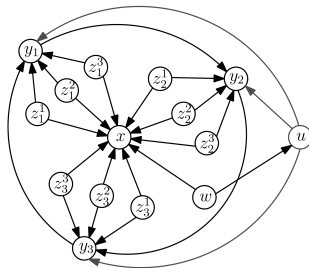
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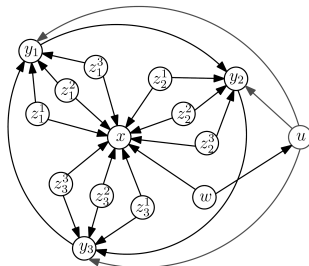
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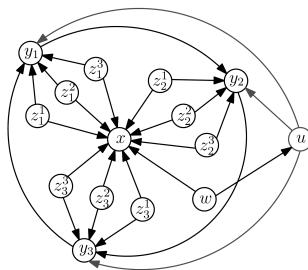
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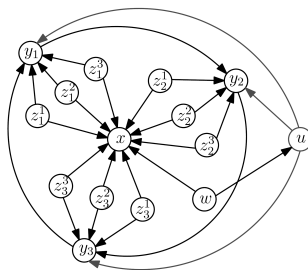
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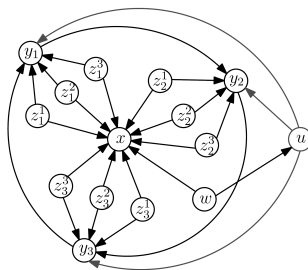
- For u :
 - Deleting $\{u, y_i\}$ increases u 's distance to y_i, z_i^1, \dots, z_i^k by one.
- For y_i 's:
 - Deleting $\{y_i, y_j\}$ increases y_i 's distance to y_j, z_j^1, \dots, z_j^k by one.
- Similarly we can prove the case for w and all z_i^j 's.





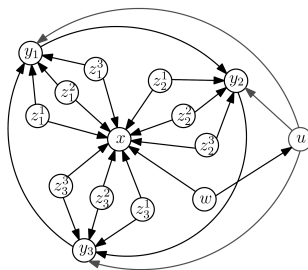
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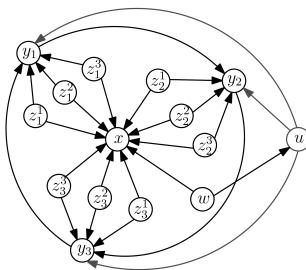
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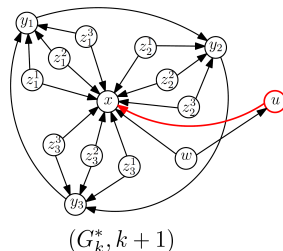
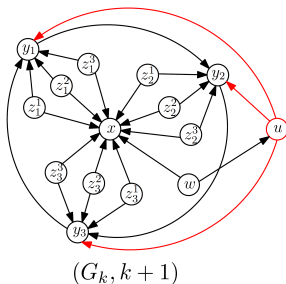
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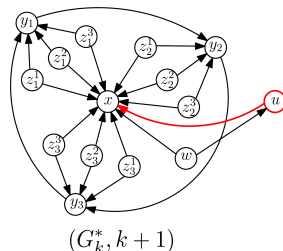
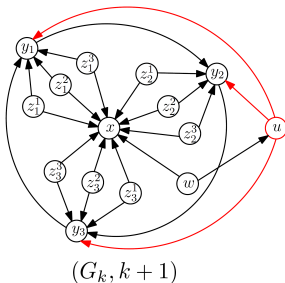
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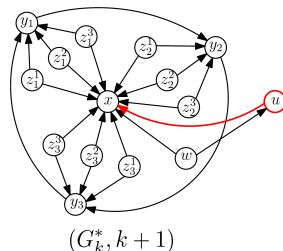
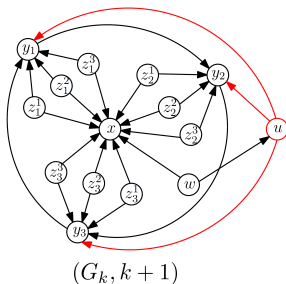
- Now, consider a strategy-change of u : $S_u = \{y_1, \dots, y_k\} \rightsquigarrow S_u^* = \{x\}$.
- Easy to check that no other S'_u with $|S'_u| \leq 1$ outperforms S_u^* .
- Adding any edge $\{u, y_i\}$ decreases the cost by $k+1$ ($= \alpha$).
 - Adding an edge towards z_i^j is even worse...
- By Lemma 1, even more edges cannot decrease u 's cost.





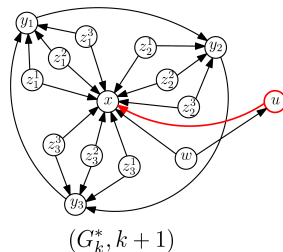
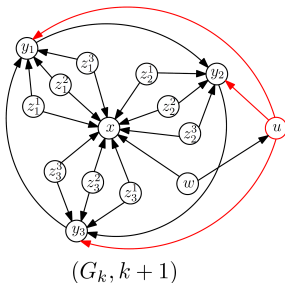
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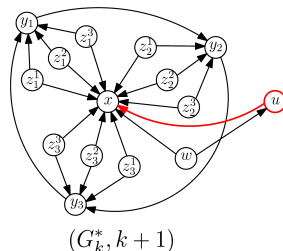
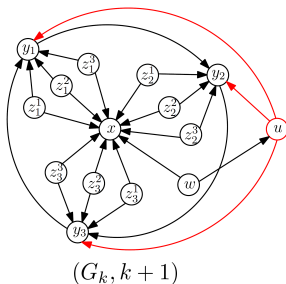
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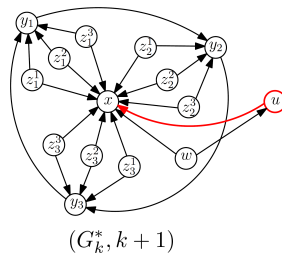
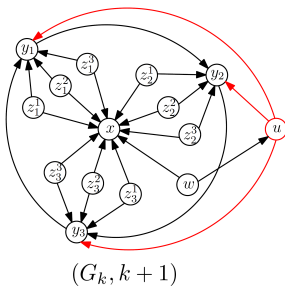
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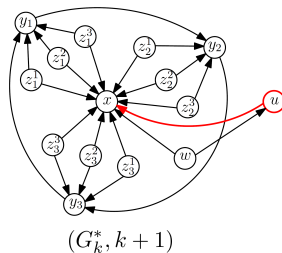
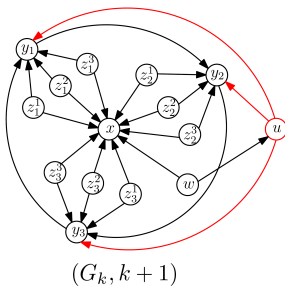
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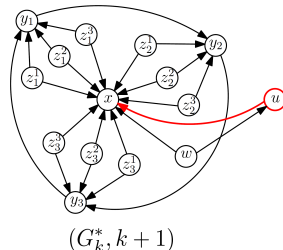
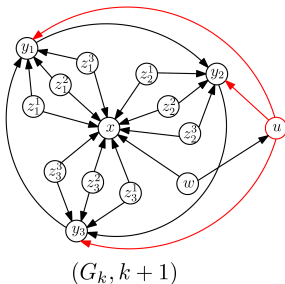
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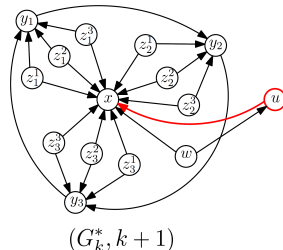
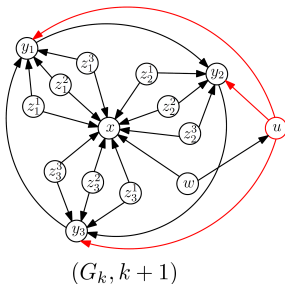
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- $$\lim_{k \rightarrow \infty} \frac{c(S_u, k)}{c(S_u^*, k)} = \lim_{k \rightarrow \infty} \frac{k\alpha + k + 1 + 2(k^2 + 1)}{\alpha + 2 + 2k^2 + 3k} = \lim_{k \rightarrow \infty} \frac{3k^2 + 2k + 3}{2k^2 + 4k + 3} = \frac{3}{2}.$$
- For any $\beta < \frac{3}{2}$, there is a k' such that $c(S_u, k') > \beta \cdot c(S_u^*, k')$
 - \triangleright SUM-GE($G_{k'}, k' + 1$) is not a β -approximate SUM-NE for $\beta < \frac{3}{2}$.





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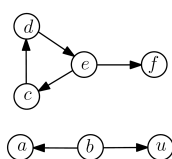
Good news

Theorem 4

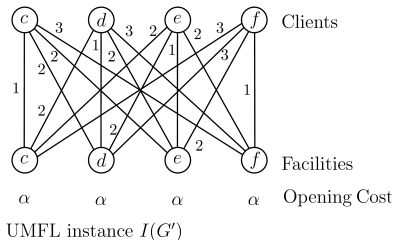
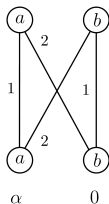
Every network in SUM-GE is in 3-approximate SUM-NE.

- Proof: providing a “locality gap preserving” reduction to the **Uncapacitated Metric Facility Location problem (UMFL)**.





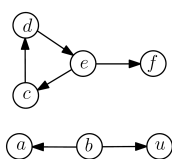
Network (G', α)



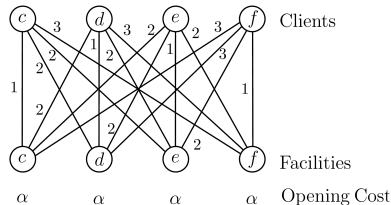
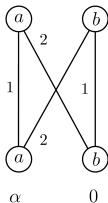
UMFL instance $I(G')$

- (G', α) : all edges owned by u are removed.
- Z : the set of vertices which own an edge towards u .
- $\mathcal{S} := \{U \mid U \subseteq (V(G') \setminus \{u\}) \text{ and } U \cap Z = \emptyset\}$.
 - u 's strategies in (G', α) (not including multi-edges or self-loop).
- $F = C = V(G') \setminus \{u\}$ (F : facilities; C : clients).
 - The *opening cost* is **0** for each $f \in Z \cap F$, others have opening cost α .
- For every $i, j \in F \cup C$, $d_{ij} = d_{G'}(i, j) + 1$.





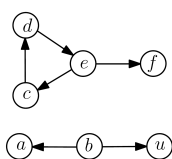
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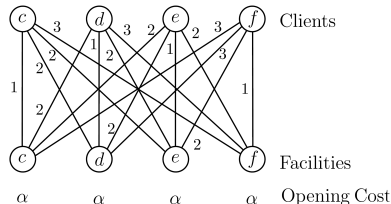
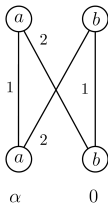
UMFL instance $I(G')$

- Any strategy $S \in \mathcal{S}$ of agent u in (G', α) corresponds to the solution of the UMFL instance $I(G')$.
 - Exactly the facilities in $F_S = S \cup Z$ are opened
 - All clients are assigned to their nearest open facility.
- Every solution $F' = X \cup Z$, where $X \subseteq F \setminus Z$, for instance $I(G')$ corresponds to agent u 's strategy $X \in \mathcal{S}$ in (G', α) .





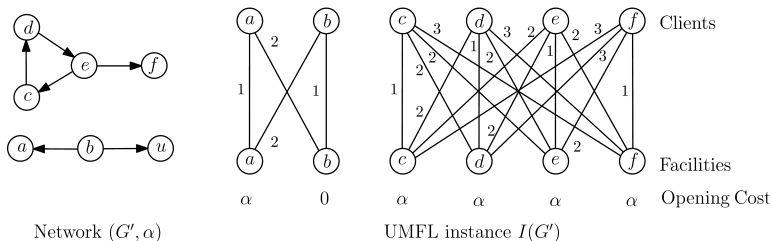
Network (G', α)



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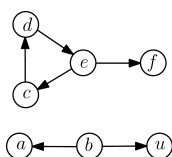




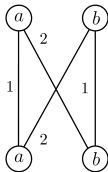
- (G_S, α) : the network (G', α) where u has bought all edges towards $v \in S$.
- $cost(F_S)$: the cost of the solution F_S to instance $I(G')$.

$$\begin{aligned}
 c_u(G_S, \alpha) &= \alpha|S| + \sum_{w \in V(G_S) \setminus \{u\}} \left(1 + \min_{x \in S \cup Z} d_{G'}(x, w) \right) \\
 &= \alpha|S| + 0|Z| + \sum_{w \in V(G_S) \setminus \{u\}} \min_{x \in S \cup Z} d_{xw} \\
 &= \alpha|F_S \setminus Z| + 0|Z| + \sum_{w \in C} \min_{x \in F_S} d_{xw} = cost(F_S).
 \end{aligned}$$

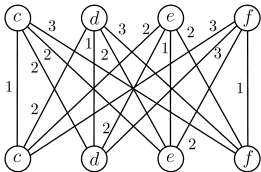




Network (G', α)



α 0



α α α α Opening Cost

Clients

Facilities

Claim

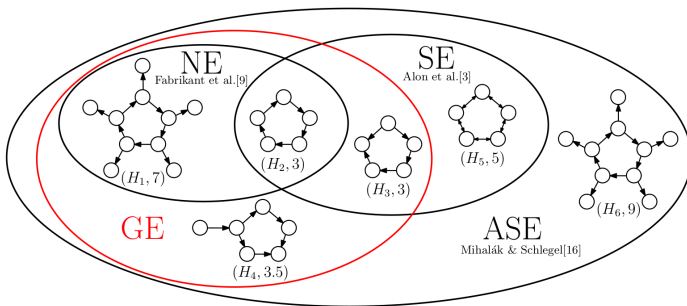
If agent u plays $S \in \mathcal{S}$ and cannot decrease her cost by buying, deleting or swapping *one* edge in (G_S, α) , then the cost of the corresponding solution to instance $I(G')$ cannot be strictly decreased by opening, closing or swapping *one* facility.

- Any UMFL solution that cannot be improved by opening, closing or swapping one facility is a 3-approximation of the optimal solution.

[Arya *et al.* SIAM J. Comput. 2004].



Concluding remarks



Concluding remarks

- PoA or PoS in SUM-GE?
- On dynamics in Selfish Network Creation (SPAA 2013).



Thank you.



