

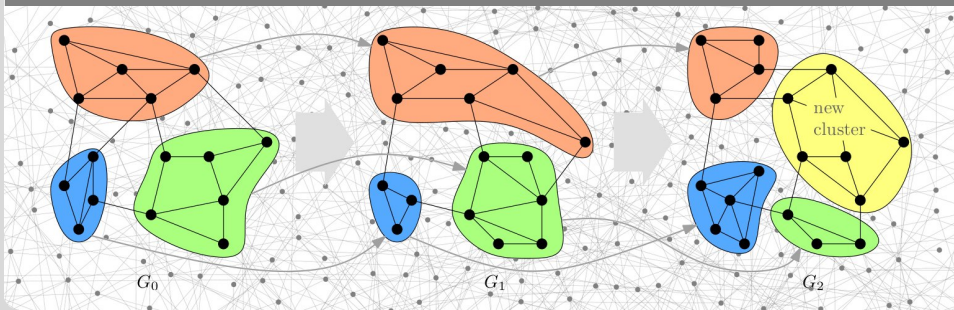
Exercises

AE for Graph Clustering

School on Graph Theory, Algorithms and Applications

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KARLSRUHE INSTITUTE OF TECHNOLOGY – INSTITUTE OF THEORETICAL INFORMATICS



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- 1 Consider reasonable desiderata for a quality measure for clusterings and try to design a measure that fulfills them.



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- 1 Consider the desiderata and the objective functions mentioned in the lecture. Try to discover violations.
- 2 How large is the best cluster editing set you can find for Zachary's Karate Club? At most 54 should be doable . . .
- 3 For some family of sparse graphs, prove that the modularity of the modularity-optimal clustering approaches 1.
- 4 Prove that plugging performance instead of coverage into the concept of modularity yields an equivalent measure.
- 5 Prove that Density-Constrained Clustering combining maximum, global or average intra-cluster density as a constraint with the number of inter-cluster edges as the objective function is NP-hard (i.e., finding the optimal clustering).



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- 1 Consider the global greedy agglomerative algorithm, using modularity as the objective function. Prove that modularity attains a single peak during the process, i.e., once it deteriorates, it never again improves.
- 2 Prove that there is always a modularity-optimal clustering where each degree-1 vertex is in the same cluster as its neighbor.



- 1 Prove the following reachability result:
Given density α , clustering \mathcal{C} and a subset $\mathcal{D} \subseteq \mathcal{C}$ of dense clusters:
 $\forall D \in \mathcal{D} : \text{density}(D) \geq \alpha$.
If \mathcal{D} 's union $U = \bigcup_{D \in \mathcal{D}} D$ is dense, i.e., $\text{density}(U) \geq \alpha$, then there exist $A, B \in \mathcal{D}$ such that $\text{density}(A \cup B) \geq \alpha$.
- 2 Prove that maximum isolated (and pairwise) inter-cluster density have unbounded merge behavior (actually you can try to prove the whole list!).



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- 1 Local movements usually repeatedly require the following information: What is the sum of the weights of all edges between a given node and a given cluster? Avoiding hashmaps where possible, think about how to implement this efficiently and take into account the time required for array initialization.



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Preliminaries

Let $G = (V, E, c)$ denote the input graph to the Cut-Clustering Algorithm and let $G_\alpha = (V \cup \{t\}, E \cup E', c_\alpha)$ result from G by adding the artificial vertex t together with the artificial edges weighted by α . A cut in G_α is denoted by (X, \bar{X}) with $X \subseteq V \cup \{t\}$. A cut in G is denoted by $(X, V \setminus X)$ with $X \subseteq V$. The notation (P, Q) with $P, Q \subseteq V$, $P \cap Q = \emptyset$ describes a cut in the subgraph of G induced by $P \uplus Q$.

Problem 1: Let \mathcal{C} denote the clustering returned by the Cut-Clustering Algorithm with respect to α and let $C \in \mathcal{C}$ denote a cluster. Show that the intra-cluster expansion

$$\Phi(C) := \min_{P, Q \neq \emptyset, P \uplus Q = C} \left\{ \frac{c(P, Q)}{\min\{|P|, |Q|\}} \right\}$$

of C is at least α .

Problem 2: Let \mathcal{C} denote the clustering returned by the Cut-Clustering Algorithm with respect to α and let $C \in \mathcal{C}$ denote a cluster. Show that the inter-cluster expansion*

$$\Phi^*(C) := \left\{ \frac{c(C, V \setminus C)}{|V \setminus C|} \right\}$$

of C is at most α .



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Starting with the X -variables from the lecture try to build the following tools:

- 1 cluster-leaders: a binary variable stating whether a vertex is the unique leader of its cluster
- 2 $|\mathcal{C}| \leq \text{given value}$
- 3 containment: binary variables stating whether vertex v is in cluster C_i
- 4 $\forall C \in \mathcal{C} : |\mathcal{C}| \leq \text{given value}$
- 5 cluster-size variables: binary variable stating whether $|C_i| = \ell$
- 6 $\forall C \in \mathcal{C} : \text{density}(C) \geq \text{given value}$



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