

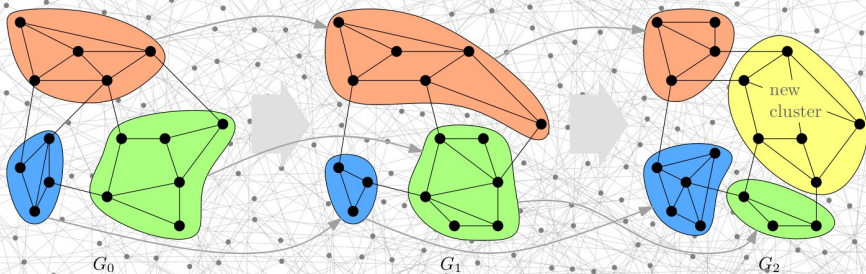
# Hints

## 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 Start with a small set of desiderata, or try the converse: it might be more contradicting combinations of desiderata



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- 1 Consider the desiderata and the objective functions mentioned in the lecture. Try to discover violations.
- 2 Don't attempt to be optimal, unless you want to spend a lot of time on it! Something close to matching is pretty good in sparse networks, start with that.
- 3 You just need the modularity of any good clustering, this is a lower bound for the optimum. Make up a clustering on a scalable sparse graph, calculate or bound its modularity. A simple quadratic grid might be a simple family.
- 4 Strenuous and technical.
- 5 Setting the density constraint to 1, the decision version is equivalent to the question: (*min-cut clique partition*) Is there a partition  $\mathcal{C}$  of  $V$  into cliques such that the number of intra-cluster edges is at least  $k$ ?  
Try to reduce from the following problem:

*Exact Cover by 3-Sets (X3C)*: Given set  $X$  with  $|X| = 3q$  and collection  $\mathcal{S}$  of 3-element subsets of  $X$ . Does  $\mathcal{S}$  contain an exact cover for  $X$ , i.e., a subcollection  $\mathcal{S}' \subseteq \mathcal{S}$  such that every  $x \in X$  occurs in exactly one  $S \in \mathcal{S}'$  ?



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- 1 Carefully note how entries in the merge matrix change.  
First find out what  $\Delta\text{mod}_{i,k}$  is, i.e., the change in modularity if  $C_i$  and  $C_k$  are merged.  
Then, given  $C_i$  and  $C_j$  are merged, show that  
$$\Delta\text{mod}_{(ij),k} = \Delta\text{mod}_{i,k} + \Delta\text{mod}_{j,k}$$
  
Based on these observations and on how the greedy algorithm works, complete the argument.
- 2 -



- 1 A vectorial point of view is one way of proving this. The key observation here is that when merging clusters, the resulting density is the vectorial (or component-wise) addition of the numerators and the denominators of the summands.
- 2 Solutions can be found in [[Schumm et al.: Density-constrained Graph clustering, 2011](#)]



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- 1 Do not re-initialize an array repeatedly, re-use the array but keep track of which entries are valid.





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**Problem 1:** We prove the assertion by contradiction. Suppose there is a cut  $(P, Q)$  in  $C$  such that  $c(P, Q) < \alpha \min\{|P|, |Q|\}$ . Without loss of generality we assume the representative  $r(C)$  is in  $P$ . Then it is

$$\begin{aligned}c_{\alpha}(P, \bar{P}) &= c(P, Q) + c(P, V \setminus C) + \alpha |P| \\ &< \alpha |Q| + c(P, V \setminus C) + \alpha |P| \\ &\leq \alpha |Q| + c(P, V \setminus C) + \alpha |P| + c(Q, V \setminus C) \\ &= \alpha |C| + c(C, V \setminus C) = c_{\alpha}(C, \bar{C}).\end{aligned}$$

This contradicts the fact that  $(C, \bar{C})$  is a minimum  $r(C)$ - $t$ -cut in  $G_{\alpha}$ .

**Problem 2:** We prove the assertion by contradiction. Suppose  $c(C, V \setminus C) > \alpha |V \setminus C|$ . Then it is

$$\begin{aligned}c_{\alpha}(\{t\}, V) &= \alpha |V \setminus C| + \alpha |C| \\ &< c(C, V \setminus C) + \alpha |C| \\ &= c_{\alpha}(C, \bar{C}).\end{aligned}$$

This contradicts the fact that  $(C, \bar{C})$  is a minimum  $r(C)$ - $t$ -cut in  $G_{\alpha}$ .



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The last item is a bit more difficult, please find suggestions for solutions in [\[Schumm et al.: Density-constrained graph clustering, 2011, full technical report version\]](#)



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