JOŽEF STEFAN POSTGRADUATE SCHOOL

Community-based semantic subgroup discovery (CBSSD)

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Introduction

Properties of biological networks

- Multiple types of nodes and edges → heterogenous networks
- Possible connections between distinct entities
- Large in some sub-domains
- Not trivial to interpret





How can an algorithm learn from a complex network?

Network representation

Important network features can be encaptured via community detection, graphlets, semantic clustering and other methods...

Example use

Such methodology is used to infer protein-RNA interactions, identify expression patterns, compare protein structures, fuse systems-level data etc.



Problem definition

Term-subset enrichment

Let $t_1, t_2, ..., t_n$ represent individual terms of interest from the whole term set ψ . Identify subsets $\Lambda_1, \Lambda_2, ..., \Lambda_n \subseteq \psi$, which represent interpretable patterns, previously unknown to a human observer.

Example situation

Let $G_1, G_2, ..., G_n$ be n distinct genes we are interested in. Although individual genes, or the whole group of genes doesn't return any interesting results, we can further explore the subspace of n genes.

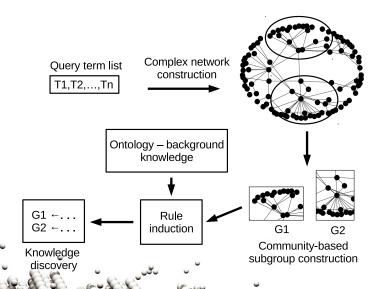
Problem

Exploring all possible combinations can be computationally expensive procedure, as there are $\sum_{i=2}^{n} \frac{n!}{(n-i)!i!}$ possible options.



Fighting the combinatorial explosion

We argue there exists an efficient heuristic-based approach.

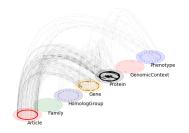




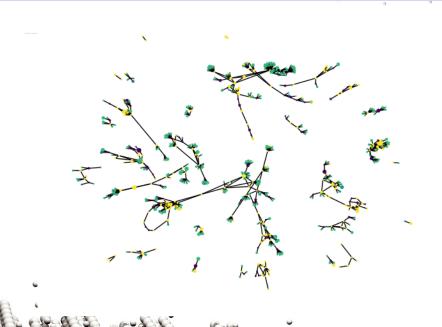
Fighting the combinatorial explosion - network construction

Basic procedure

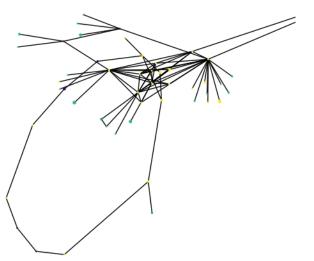
- collect network data on the studied phenomenon
- merge the data into a single heterogeneous network
- simplify the obtained network, or learn directly from it











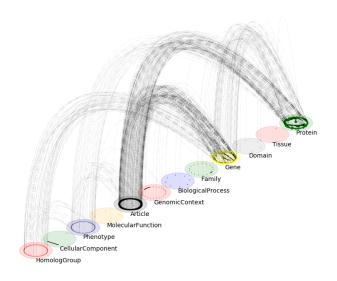








Up to 8 layers of interconnected information





Subset extraction

Extraction algorithm

A multiplex network Ψ is decomposed into individual communities via the use of *Louvain* algorithm. Initial term list ψ is then splitted according to community presence, such that initial terms $t_1,...,t_n$ are assigned to a subset $\phi_{x,...,y} \in \psi$ iff $\exists t_{x,...,y} \in \Psi_{x,...,y}$.

