Graph based clustering

Author Disambiguation Data Preprocessing DMKM

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Abstract

As part of the author disambiguation a feature construction based on graph theory is desired to exploit the inner structure of the data as a social network.

Introduction

Collaboration Networks first described by Paul Erdös consists of a graph of individuals represented as dots and they relations represented as edges connecting the dots.

Collaboration Networks can be fully defined with two sets, a set of vertices and a set of edges. In this case we can define the set of vertices as the set of signatures composed of (id, article - id, author - id) where id is a consecutive unique number assigned to each signature, article - id is the unique number assigned to each article and author - id is the unique number assigned to each different author string. And the set of edges as a binary relation (undirected) between two signatures if they have the same article - id and different author - id, the last to avoid $self\ relations$

The described graph can be proved to be $simple^1$ and $small\ world^2$, the later characterises the distance between any two points, defined as

$$d(v_i, v_j) = \arg\min_k P(v_i, v_j), \tag{1}$$

that is the minimum length path between to vertices³, to be

$$E[d(v_i, v_j)] = K$$

$$K \propto \log N,$$
(2)

that is the average distance between any two vertices grows as the logarithm of the number of vertices.

In some cases a collaboration can be characterised as $scale\ free^4$ if the presence of hubs the average distance grows as

$$K \propto \log \log N.$$
 (3)

Small world graphs can be modelled as *Watss-Strogatz random graphs* with just two parameters, namely the clustering coefficient and the average node-to-node distance as shown in 1

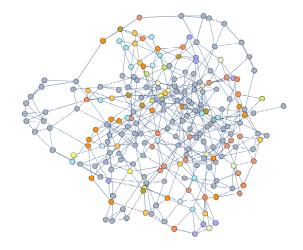


Figure 1: Watss-Strogatz random graph with 15² nodes.

Methods

The objective is to construct a feature based on the distance between two signatures as part of the analysis and with this help to decide whether two signatures correspond to a particular community or cluster.

Given the data set $\{(s_i,s_j)\in S\times S, i\neq j\}$ where S is the set of signatures. We can compute the distance $d(s_i,s_j)$ for each pair by first constructing the graph at depth λ between s_i,s_j , that is to take the neighbours of s_i and the neighbours of the neighbours of s_i and so on λ times, and the same for s_j . With this

¹With no self relations, all edges are undirected thus making the edges a set and not a multiset.

²In which most nodes are not neighbors of one another, but most nodes can be reached from every other node by a small number of hops or steps

³If the graph is not *connected* and there exists no path between to vertices, their distance is said to be infinite

⁴or ultra-small world

graph we need to find the minimum length path. If there exists no path, then we can assume that the distance $d(s_i, s_j)$ is at least bigger than 2λ and include this distance as feature in the dataset.

Results

A graph with 5,000 edges and nodes was constructed as described, and plotted as show in figure 2

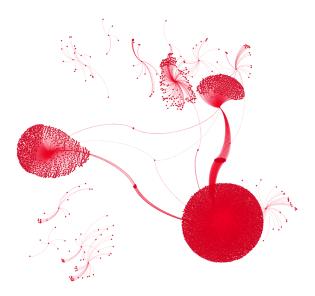


Figure 2: Graphical result of the incomplete graph of around $5{,}000$ nodes and edges.

This result was produced using a brute-force approach in SQL. A more refined function is yet to be implemented as a recursive call which will reduce the complexity. The complete graph can be of size 10^12 which is unfeasible.