# САНКТ-ПЕТЕРБУРГСКИЙ ГОСУДАРСТВЕННЫЙ УНИВЕРСИТЕТ Математико-механический факультет

Кафедра Информатики

### Проданов Тимофей Петрович

# Адаптивный рандомизированный алгоритм выделения сообществ в графах

Бакалаврская работа

Допущена к защите. Зав. кафедрой:

Научный руководитель: д. ф.-м. н., профессор О.Н. Граничин

> Рецензент: В.А. Ерофеева

## SAINT-PETERSBURG STATE UNIVERSITY Mathematics & Mechanics Faculty

Department of Computer Science

### Timofey Prodanov

# Adaptive randomised algorithm for community detection in graphs

Bachelor's Thesis

Admitted for defence. Head of the chair:

Scientific supervisor: Professor Oleg Granichin

> Reviewer: Victoria Erofeeva

## Оглавление

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#### 0.1. Размер возмущения

Коэффициент d отвечает за то, насколько сильно будет возмущаться центральная точка для получения следующих измерений. То есть, насколько  $k_n^+$  и  $k_n^-$  будут отличаться от  $\hat{k}_{n-1}$ . Зависимость модулярности от размера возмущения при  $f(Q,k) = -10 \ln Q, \ \sigma = 500, \ k_0 = 10$  будет выглядеть следующим образом:

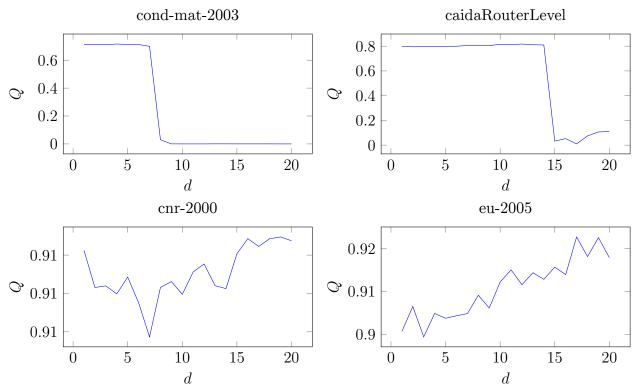
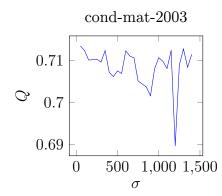


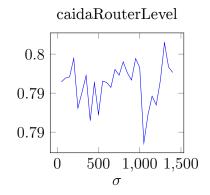
Рис. 1: Зависимость модулярности от размера возмущения на четырёх графах

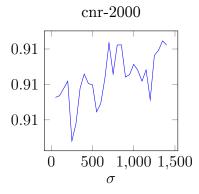
На графах cnr-2000 и eu-2005 значения модулярности не очень сильно менялись в зависимости от параметра d, хотя некоторые значения d и давали более большие значения. Однако на графах cond-mat-2003 и caidaRouterLevel после некоторого порогового значения возмущения модулярность показывала, что получившееся разбиение не лучше случайного.

#### 0.2. Количество итераций в одном шаге

Параметр  $\sigma$  указывает, как часто меняется k в рандомизированного жадном алгоритме. Так как в функции качества используется медиана прироста модулярности, а не прирост модулярности за все  $\sigma$  шагов — при изменении  $\sigma$  нет необходимости менять функцию качества, модулярность прироста будет оставаться приблизительно такой же по величине, в то время как прирост модулярности линейно зависит от  $\sigma$ . Зависимость модулярности от количества итераций в одном шаге при  $d=5,\ f(Q,k)=-10\ln Q,\ k_0=10$  принимает такой вид:







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