

POLITECNICO DI MILANO

Facoltà di Ingegneria

Scuola di Ingegneria Industriale e dell'Informazione

Dipartimento di Elettronica, Informazione e Bioingegneria

Master of Science in
Computer Science and Engineering



A FANCY TITLE FOR A FANCY THESIS

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Insert here your dedication.
Optional.

ABSTRACT

Here goes the abstract, a summary of your thesis work. You may add some keyword at the end that clearly identify the research field of the thesis. The abstract should not contain any reference to related works.

Keywords keyword1; keyword2; keyword3

SOMMARIO

In questo capitolo puoi inserire l'abstract della tesi in italiano.

Parole chiave keyword1; keyword2; keyword3

ACKNOWLEDGEMENTS

In this chapter, you can acknowledge the people that were somehow helpful in the realization of the thesis. It is better to keep this chapter formal, you can add the friendly thanks at the end (chapter Thanks).

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INTRODUCTION

1.1 CONTEXT

This is basically an extension of the abstract. Here you provide context for the problem faced. Keep in mind that even if you now have gained expertise on it, most of the readers are not so inside the problem as you are. Start from the basics and explain clearly. You can also introduce here some hints about the methodology and your contribution. For this purpose, you may also decide to add more sections.

1.2 THESIS OUTLINE

Here you explain the structure of the thesis.

Example

The thesis is structured in the following way:

- In chapter 2, we present
- In chapter 3, we formulate the problem we address in the thesis and
- In chapter 4, we present our solution for
- In chapter 5, we show experimental results of our proposed methods in different settings
- Finally, in chapter 6, we present our conclusions and possible future paths toward which our work could be extended.

PRELIMINARIES AND STATE OF THE ART

2.1 PRELIMINARY NOTIONS

Notation	Description
G	Graph
V	set of nodes of G
E	set of edges of G
W	set of weights corresponding to each edge in E
$w_{u,v}$	weight of edge (u, v)
n	$ V $, number of nodes
m	$ E $, number of edges

Table 2.1: Graph notation.

"In this section, we introduce the preliminary notions at the base of our study. We start by briefly introducing the problem, and then we provide the necessary concepts and the notation used."

You may insert a subsection for each of the most relevant features of your problem. You can add some reference if needed, but just to explain the problem. The references with the solutions of the problem should be put in the next section.

You can keep a notation table for the notation used in this chapter as Table 2.1. Everything inside the notation table must be written at least once inside this chapter. You can put an extended notation for the whole thesis in the appendix.

It is likely that you have to present definitions, theorems or propositions. We suggests to use the environments provided by the template. You can find the guide in the LaTeX suggestions chapter.

2.2 STATE OF THE ART

In this section, we survey the most relevant works related to the argument of your thesis. If you face a problem that has more than one macro-topic, you may choose to add a subsection for each of these topics (better no more than 2-3), like *Related works on Topic 1*, etc.

List the works in chronological order and cite only the most important and pertinent ones, avoid 100 citations for a master thesis.

L^AT_EX SUGGESTIONS

REMOVE THIS CHAPTER BEFORE SUBMISSION

In this file there are listed some tips you may find useful. Some of the shortcuts shown are custom, so I suggest you to have a look at what's next even if you are expert in LaTeX.

MATH

All the fonts supported by the template provide a math variant for the formulas. You can use the standard math commands of LaTeX plus the following additions:

- Argmin/max: $\arg \min_i$, $\arg \max_i$, and their rendering in centered equations

$$\arg \min_i \quad \arg \max_i$$

- Variance: Var , $\text{Var}[p]$
- Expected value: $\mathbb{E}$, $\mathbb{E}[p]$

CUSTOM COMMANDS

We provide two commands you may find useful.

The command `\blankpage` adds a blank page. Differently from `\newpage`, the added page is completely blank and the text resume from the page after.

The command `\todo` let you add the **TODO** symbol in the text. You can use it whenever you have text to be revisioned after.

ENVIRONMENTS

The thesis package provide three useful packages you may need for the theoretical part.

DEFINITION

Definitions are used for introducing a concept and its theoretical meaning for the first time. Do not use it just for clarifying the notation. Definitions are numbered within the chapter, such that the first definition of chapter 2 is 2.1. The syntax is the following:

```
\begin{definition}[NAME (optional)]  
\label{def:LABEL}  
DEFINITION  
\end{definition}
```

Example:

Definition 2.1 ((α, β) -approximation). An (α, β) -approximation algorithm outputs with success probability β a solution which is at least α fraction of the optimal solution, for some $\alpha, \beta \leq 1$.

THEOREM

Theorems are numbered incrementally within the thesis, regardless of the chapter they are declared in. The syntax is the following:

```
\begin{theorem}  
\label{thm:LABEL}  
THEOREM  
\end{theorem}
```

Example:

Theorem 1. For a non-negative, monotone, submodular function $f(\cdot)$, let S_k be a set obtained by selecting k elements one at a time, each time choosing an element that provides the largest marginal increase in the function value. Let S_k^* be a set that maximizes the value of $f(\cdot)$ over all k -sized sets. Then,

$$f(S_k) \geq \left(1 - \frac{1}{e}\right) \cdot f(S_k^*).$$

LEMMA

Lemma are like theorems. The syntax is the following:

```

\begin{lemma}
\label{thm:LABEL}
LEMMA
\end{lemma}

```

Example:

Lemma 1. *This is a lemma.*

PROPOSITION

Propositions are like lemmas but they are numbered within the chapter. The syntax is the following:

```

\begin{proposition}
\label{thm:LABEL}
PROPOSITION
\end{proposition}

```

Example:

Proposition 2.1. *If the diffusion process starting with S is simulated independently at least $r = \Omega\left(\frac{n^2}{\varepsilon^2} \ln\left(\frac{1}{\delta}\right)\right)$ times, then the average number of activated nodes over these simulations is a $(1 \pm \varepsilon)$ -approximation to $\sigma(S)$, with probability at least $1 - \delta$.*

ALGORITHM

The algorithm environment is used to show pseudocodes. The syntax, which follows the same paradigm of table/tabular combo, is the following:

```

\begin{algorithm}[FLOATING OPTIONS]
\caption{CAPTION}
\label{alg:LABEL}
\begin{algorithmic}[1 if you want the lines to be numbered]
ALGORITHM
\end{algorithmic}
\end{algorithm}

```

Example:

Algorithm 1 Combinatorial Thompson Sampling

Input: Directed graph $G(V, E)$, budget constraint k , time horizon T

- 1: **for** $i = 1$ **to** $|E|$ **do**
 - 2: $\alpha_i = 1, \beta_i = 1$ $\triangleright$ Assign a Beta distribution $\text{Beta}(1,1)$ to each edge
 - 3: **for** $t = 1$ **to** T **do**
 - 4: For each arm i , draw a sample $\theta_i(t) \sim \text{Beta}(\alpha_i, \beta_i)$
 - 5: Let $\boldsymbol{\theta}(t) = (\theta_1(t), \dots, \theta_m(t))$
 - 6: $S_t \leftarrow \text{oracle}(G(V, E, \boldsymbol{\theta}(t)), k)$
 - 7: Run cascade with S_t as the seed set and collect the feedback F_t
 - 8: Update the Beta distributions of the edges involved using F_t
-

REFERENCING

All the declared environments above can be referenced using the `\autoref` command. Definition 2.1, Theorem 1, Proposition 2.1, Algorithm 1.

PROBLEM FORMULATION

This chapter is dedicated to the formal presentation of the problem with the technical details. Here you should put also the figure of merit you use to compare your solution with the ones of the related works you presented.

Example

In this thesis, we address the problem of [Description of the problem and classical approaches]. The figure of merit we use to compare the solutions is

"This approach is similar to the one proposed in a recent work by Nuara et al. [2], in which ..."

EXPERIMENTAL EVALUATION

This chapter shows the results of the experiments carried out to assess your contribution, usually compared to state of the art solutions. In the proposed structure, we separate experiments setup from experiment results, in which we list the experiments. This is especially convenient in case the setting is the same or very similar for all the experiments. Should this not be the case, you may consider instead to structure each experiment in a section/subsection and embed both setting and result inside it.

Example

In this chapter, we present experimental results on the algorithms proposed and we compare them with state of the art methods.

5.1 EXPERIMENTAL SETTING

First, describe the experimental setting. The setting usually contains:

- the dataset(s) used for the experiments;
- the baselines, namely the other solutions with which you are comparing yours.

Example

Name	n	m
Email	1005	25571

Table 5.1: Dataset used for the experiment.

Datasets Table 5.1 shows the characteristics of the real-world dataset used for the experiment. The dataset, provided by SNAP [1], *email-*

Eu-core, has been generated using email data from a large European research institution. A directed edge (u, v) means that person u sent an e-mail to person v .

As widely done in literature, we assigned the ground-truth influence probabilities according to the weighted cascade model, that is, $p_{u,v} = \frac{1}{|In(v)|}$, for each edge $(u, v) \in E$.

Algorithms For the learning process, we use the Thompson Sampling (TS) as principal exploration strategy (**Algorithm 1**). For the sake of completeness, we show also results with a Pure Exploitation (PE) approach, in which the oracle is fed with the mean estimates of the influence probabilities at each round.

5.2 RESULTS

In this section, we show and comment the results obtained from the experiments. Remember to comment every result and every figure you decide to insert in the thesis.

Example

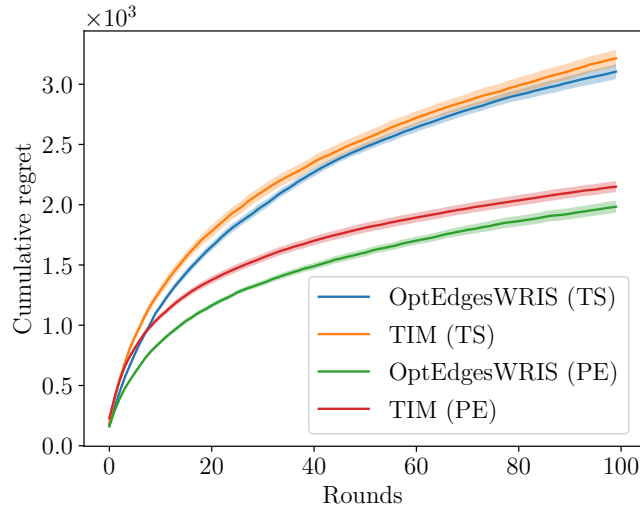


Figure 5.1: Cumulative regret in Email-In4 with 95% confidence interval.

Experiment 1 In this experiment, we test the algorithms on Email over a time horizon of $T = 100$ rounds. The objective is to show the performances of the algorithms. The results have been averaged over 30 runs. **Figure 5.1** shows the cumulative regret, with a 95% confidence interval.

As shown in the plot, our algorithm performs better with both the exploration strategies. However, the gain on TIM is more evident with the PE strategy, specially in the first rounds.

CONCLUSIONS AND FUTURE WORKS

In this chapter, you present the conclusions of your thesis and a couple of possible future works to extend your results. First of all, you should briefly repeat the problem you addressed in the thesis. Then, you report your achievements and how they improve the state of the art.

6.1 CONCLUSIONS

Example

In this thesis, we analyzed the problem of We proposed a new approach that We tested this method on Reported results show that our proposal outperforms the state of the art method.

6.2 FUTURE WORKS

Example

There are several appealing paths for future works. A possible extension could be to

Notation	Description
G	influence graph
V	set of nodes of G
E	set of edges of G
W	set of influence weights corresponding to each edge in E
$w_{u,v}$	weight of edge (u, v)
n	$ V $, number of nodes
m	$ E $, number of edges

Table A.1: Notation used.

ACKNOWLEDGMENTS

Here you can insert optionally the acknowledgments for who had a significant importance for the accomplishment of this goal. These acknowledgments are less formal than the ones at the beginning of the thesis and are not listed in the table of contents.

BIBLIOGRAPHY

- [1] Jure Leskovec and Andrej Krevl. SNAP Datasets: Stanford large network dataset collection. <http://snap.stanford.edu/data>, June 2014.
- [2] Alessandro Nuara, Francesco Trovò, Dominic Crippa, Nicola Gatti, and Marcello Restelli. Driving exploration by maximum distribution in gaussian process bandits. In *Proceedings of the 19th International Conference on Autonomous Agents and MultiAgent Systems*, pages 948–956, 2020.