#### IT UNIVERSITY OF COPENHAGEN

# Clustering Player Behaviors Efficiently with K-Means in Map-Reduce

by

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in the

Computer Science Software Development and Technology

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#### Abstract

The abstract is a short summary of the thesis. It announces in a brief and concise way the scientific goals, methods, and most important results. The chapter "conclusions" is not equivalent to the abstract! Nevertheless, the abstract may contain concluding remarks. The abstract should not be discursive. Hence, it cannot summarize all aspects of the thesis in very detail. Nothing should appear in an abstract that is not also covered in the body of the thesis itself. Hence, the abstract should be the last part of the thesis to be compiled by the author.

A good abstract has the following properties: Comprehensive: All major parts of the main text must also appear in the abstract. Precise: Results, interpretations, and opinions must not differ from the ones in the main text. Avoid even subtle shifts in emphasis. Objective: It may contain evaluative components, but it must not seem judgemental, even if the thesis topic raises controversial issues. Concise: It should only contain the most important results. It should not exceed 300–500 words or about one page. Intelligible: It should only contain widely-used terms. It should not contain equations and citations. Try to avoid symbols and acronyms (or at least explain them). Informative: The reader should be able to quickly evaluate, whether or not the thesis is relevant for his/her work.

An Example: The objective was to determine whether  $\dots(question/goal)$ . For this purpose,  $\dots$  was  $\dots(methodology)$ . It was found that  $\dots(results)$ . The results demonstrate that  $\dots(answer)$ .

# Acknowledgements

The acknowledgements and the people to thank go here, don't forget to include your project advisor. . .

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# Appendix A

# Appendix Title Here

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