

# CloFAST: Closed Sequence Mining based on Sparse Id-List

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## ABSTRACT

The mining of closed sequential patterns has attracted researchers because of its capability to use compact results to preserve the same expressive power as traditional mining, and because of its efficiency. In this paper we propose CloFAST a novel algorithm for mining closed frequent sequences. CloFAST combines a new data representation of the dataset (*sparse id-list* and *vertical id-list*) with a new two-step strategy for fast support counting and space pruning. Although CloFAST is based on a *candidate maintenance-and-test approach*, it still outperforms the BIDE algorithm [?] by two orders of magnitude. CloFAST is also able to mine long closed sequences by reducing the effort required for support counting, search space pruning, and candidates generation. Experimental evaluation shows that the proposed approach is two orders of magnitude faster than BIDE with a modest increase in memory cost.

of applications, including web mining [?], classification [?], finding copy-paste and related bugs in large-scale software code [?] and mining motifs from biological sequences [?]. A sequential pattern mining algorithm mines a sequence database looking for repeating patterns that can be used to find associations among the different items or events in their data. The algorithms presented in literature have good performance in databases comprised of short sequences [?, ?, ?, ?]. Unfortunately, when these algorithms are used to mine long sequences they generate an exponential number of sequences, especially for lower support thresholds, which make analysis difficult. Moreover the performance of such algorithms often degrades dramatically in both time and space as the support threshold is lowered.

## Categories and Subject Descriptors

A.4 [Frequent sets and patterns]: Frequent Closed Sequential Patterns

## General Terms

Algorithm, Sequential Patterns, Closed Sequences

## Keywords

Data Mining, Descriptive Models, Sparse id-list, Vertical id-list

## 1. INTRODUCTION

Since its introduction [?], sequential pattern mining has become a fundamental data mining task with large spectrum

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