

Continuous Pattern Mining Using The FCPGrowth Algorithm In Trajectory Data Warehouses

Marcin Gorawski, Paweł Jureczek
Silesian University of Technology
Institute of Computer Science

e-mail: {Marcin.Gorawski, Pawel.Jureczek}@polsl.pl
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Outline

- Motivations
- FCP-Tree
- FCPGrowth
- Results
- Conclusion
- Future work

Motivations

- great interest in mining behavior patterns
- efficient mining of frequent continuous patterns of mobile objects
- large dataset of long trajectories

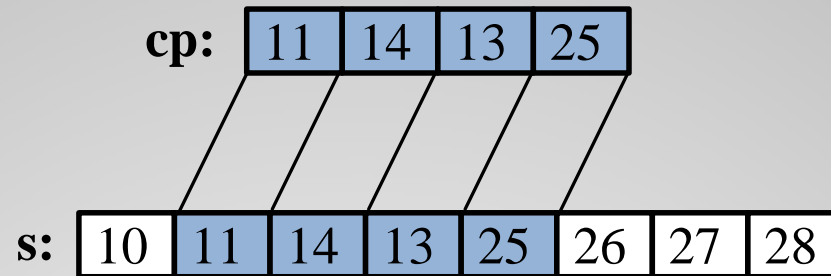
Frequent continuous patterns

Definitions:

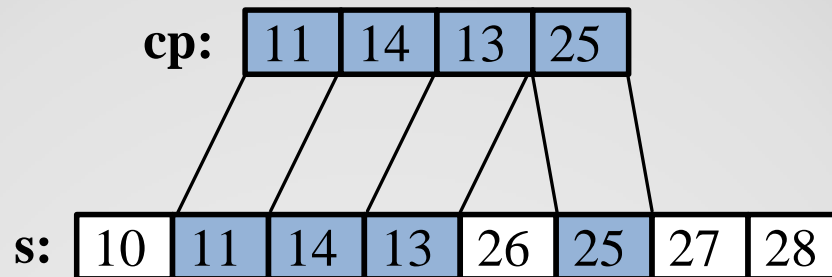
- 1) Given two sequences $X = \langle b_1 b_2 \dots b_m \rangle$ and $Y = \langle a_1 a_2 \dots a_n \rangle$, where $m \leq n$, the sequence X is a continuous subsequence of Y if there exists an integer i such that $b_1 = a_i, b_2 = a_{i+1}, \dots, b_m = a_{i+m-1}$, and if for any two elements b_i and b_j ($i \neq j$) we have $b_i \neq b_j$.
- 2) $\text{sup}(s) = |\{s \mid s_i \in S \wedge s \subseteq s_i\}| / m$ where $S = \{s_1, s_2, \dots, s_m\}$
- 3) $\text{sup}(s) \geq \text{min_sup}$

Continuous pattern - Example

a)

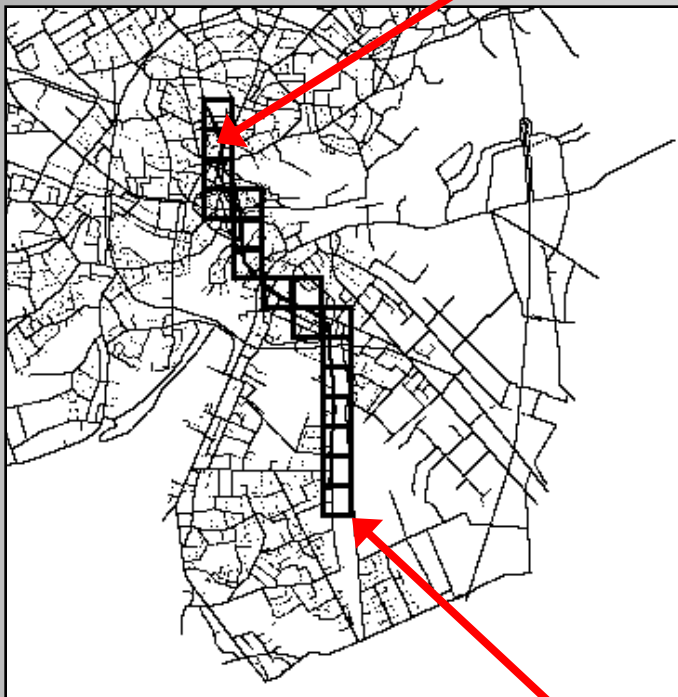


b)



Spatio-temporal continuous sequence

trajectory of points



sequence of regions

Steps:

- determine grid resolution
- map the points of a given trajectory into regions of the sequence

FCP-Tree

- prefix tree
- compressed data structure
- header table

Building FCP-Tree – Example (1)

a) sequence database with minimum support ***minsup*=33,3%**

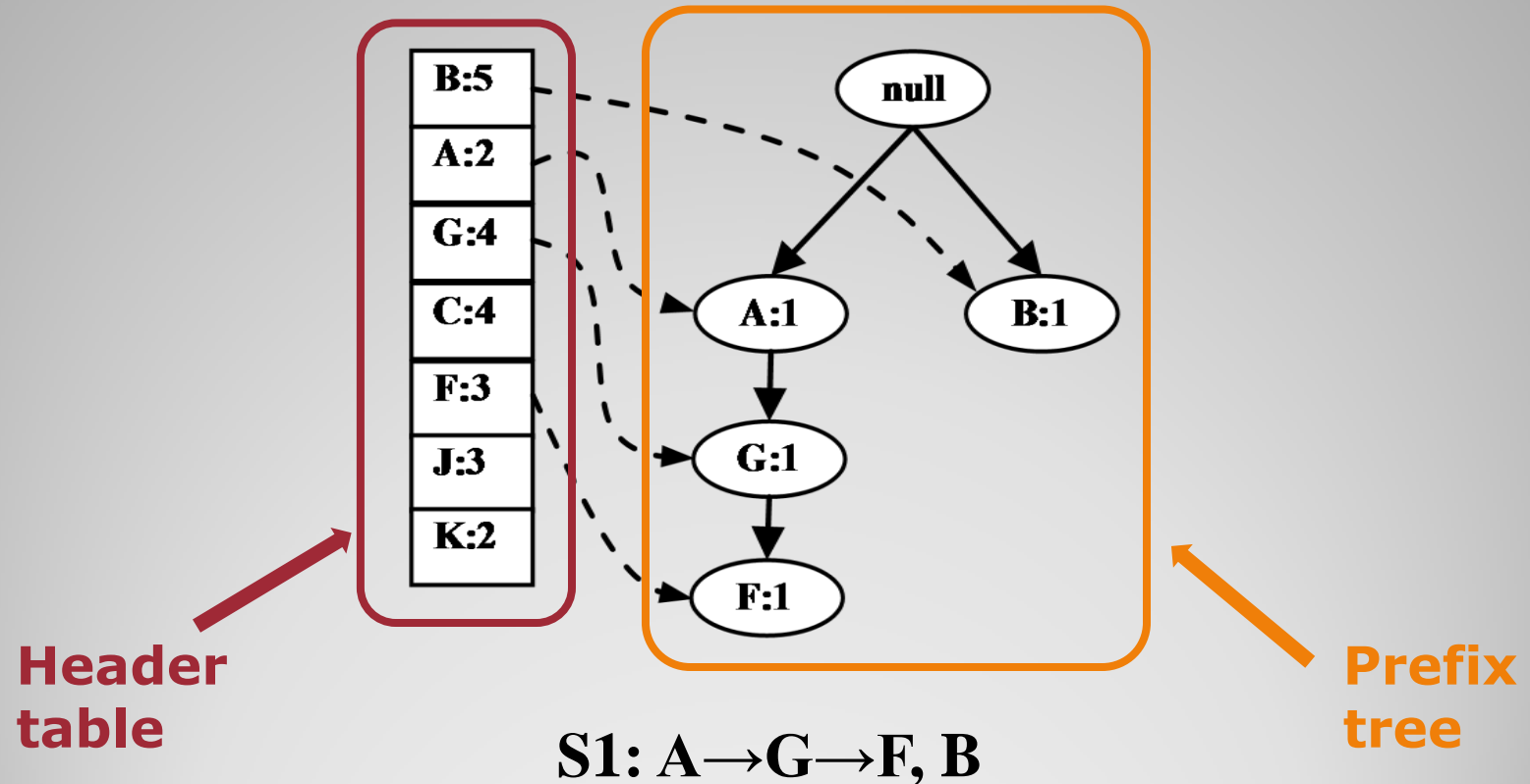
| No | Input sequence |
|----|----------------|
| 1 | A→G→F→I→B |
| 2 | A→G→F→J→K |
| 3 | C→G→Z→B |
| 4 | B→G→F |
| 5 | B→C→J→K |
| 6 | B→C→J |

b) support for elements: **A:2, B:5, C:3, F:3, G:4, I:1, J:3, K:2, Z:1**

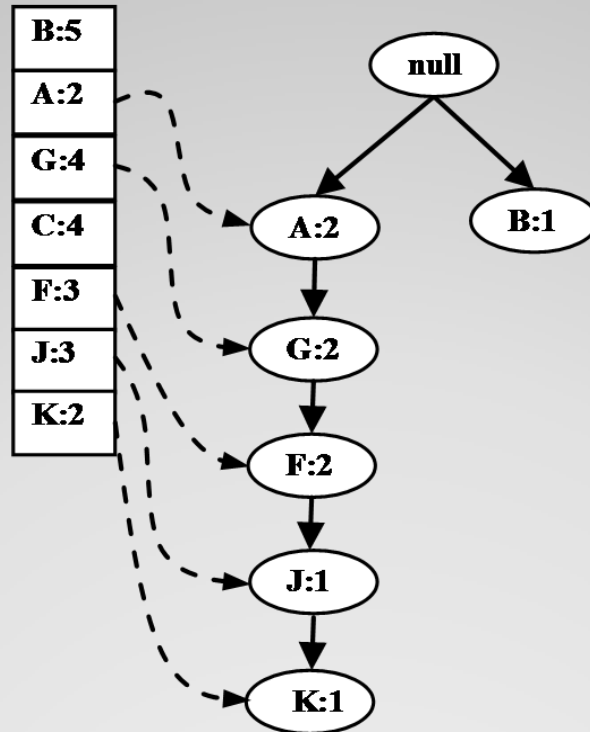
Building FCP-Tree – Example (2)

| No | Input | Output |
|----|---|---|
| 1 | $A \rightarrow G \rightarrow F \rightarrow I \rightarrow B$ | $A \rightarrow G \rightarrow F, \mathbf{B}$ |
| 2 | $A \rightarrow G \rightarrow F \rightarrow J \rightarrow K$ | $A \rightarrow G \rightarrow F \rightarrow J \rightarrow K$ |
| 3 | $C \rightarrow G \rightarrow Z \rightarrow B$ | $C \rightarrow G, \mathbf{B}$ |
| 4 | $B \rightarrow G \rightarrow F$ | $B \rightarrow G \rightarrow F$ |
| 5 | $B \rightarrow C \rightarrow J \rightarrow K$ | $B \rightarrow C \rightarrow J \rightarrow K$ |
| 6 | $B \rightarrow C \rightarrow J$ | $B \rightarrow C \rightarrow J$ |

Building FCP-Tree – Example (3)

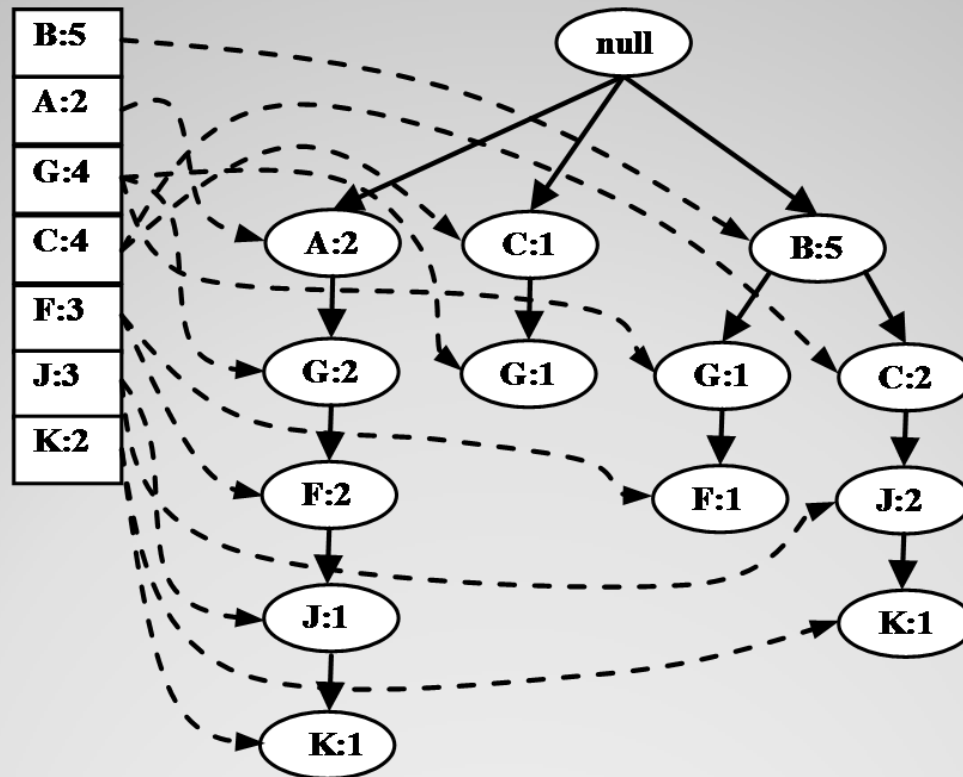


Building FCP-Tree – Example (4)



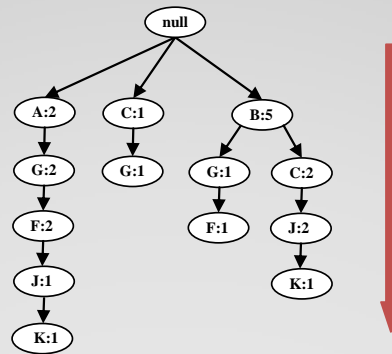
S2: A → G → F → J → K

Building FCP-Tree – Example (5)



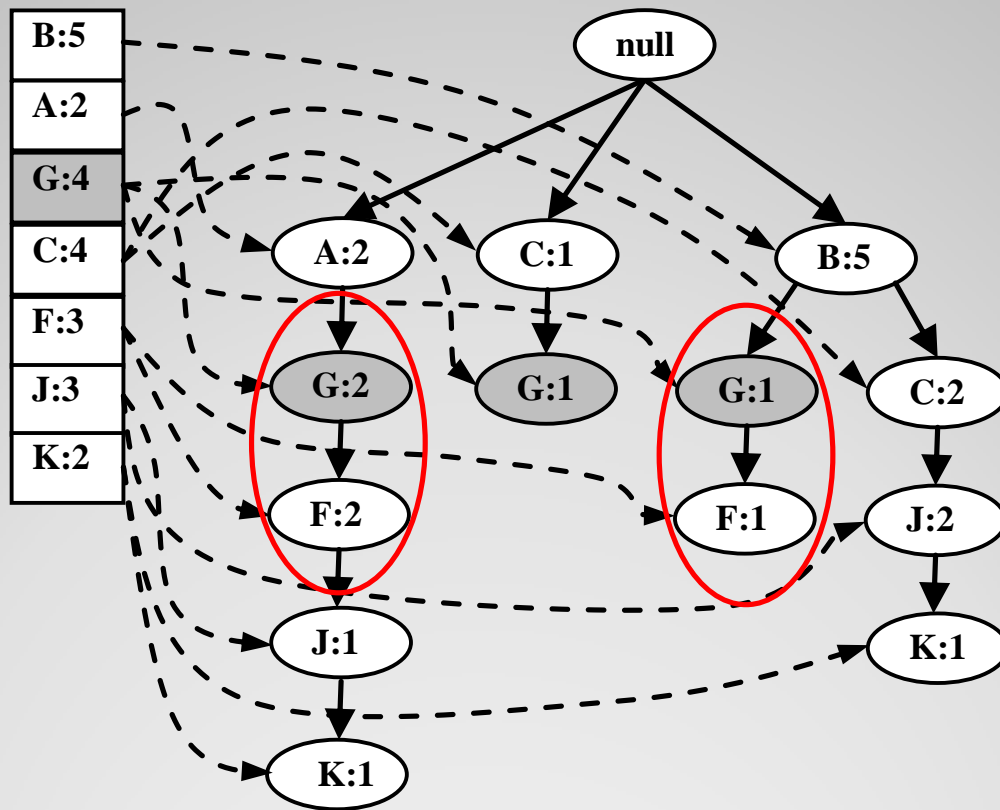
FCPGrowth

- top-down approach



- divide and conquer
- no intermediate subtrees

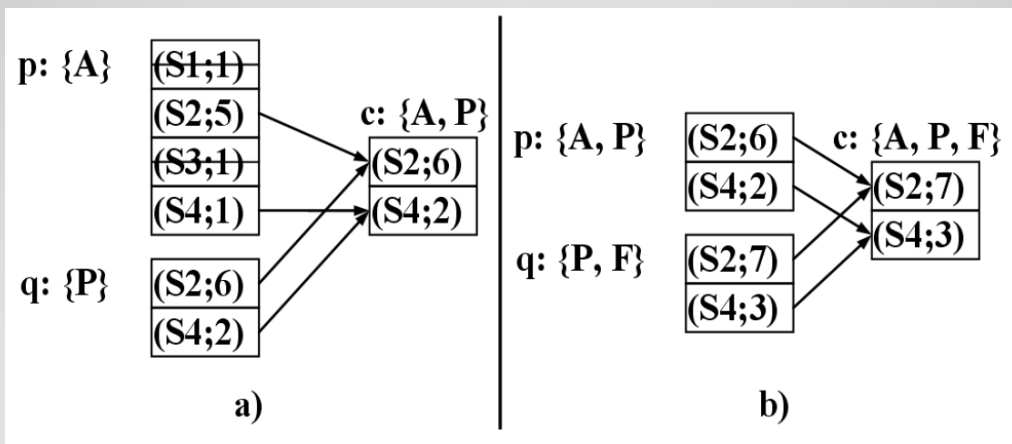
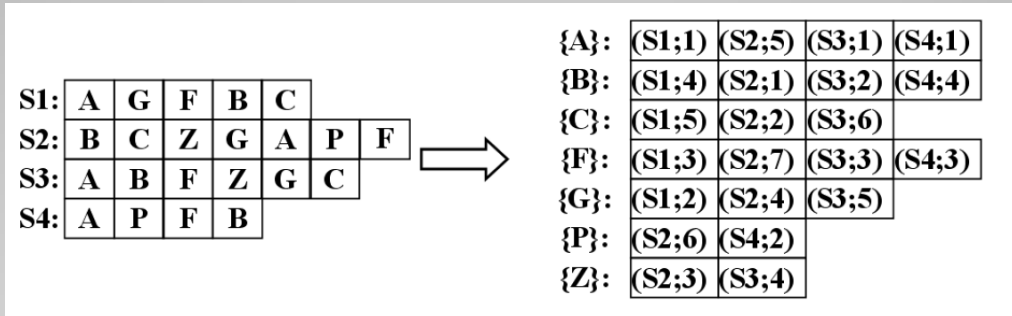
FCPGrowth – Example



Experimental results

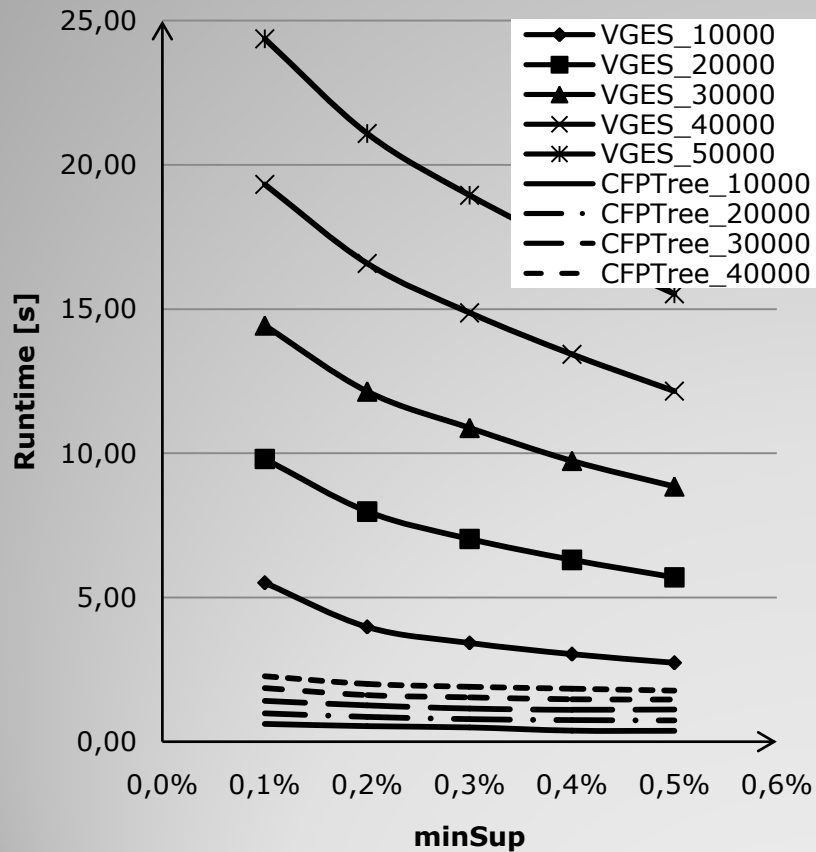
- Brinkhoff's network-based generator
- No. of Sequences: 10 – 50k
- minsup: 0.1 – 0.5%
- Avg. length: ~ 14.3
- Unique elements: 550 \sim 630

VAES (Vertical Approach for Exact Search)

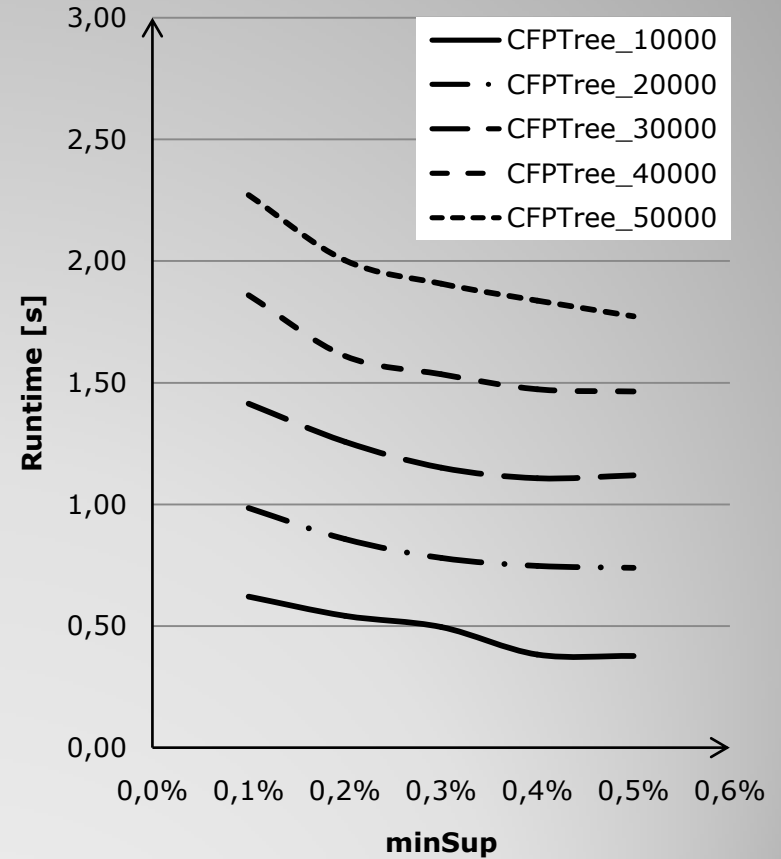


minsup=2

Experiments



a)



b)

Conclusion

- promising approach for compressing continuous sequences
- algorithm for mining continuous patterns
- experiments

Future work

- analysis of the tree size and complexity
- maximal and closed pattern extensions
- real data experiments

**Thank you for your
attention!**