

#### **Department of Informatics**

University of Zurich Department of Informatics Binzmühlestr. 14 CH-8050 Zürich Phone. +41 44 635 43 11 Fax +41 44 635 68 09 www.ifi.uzh.ch/dbtg

UZH, Dept. of Informatics, Binzmühlestr. 14, CH-8050 Zurich

Student Name

Switzerland

Zürich, 26. Februar 2013

# Centroid Decomposition Based Recovery for Segmented Time Series

# BSc/MSc Thesis:

## Work overview:

The Centroid Decomposition (CD) is a matrix decomposition technique that decomposes an  $n \times m$  matrix  $\mathbf{X} = [X_1| \dots |X_m]$  into an  $n \times m$  *loading* matrix  $\mathbf{L} = [L_1| \dots |L_m]$  and an  $m \times m$  *relevance* matrix  $\mathbf{R} = [R_1| \dots |R_m]$  as follows:

$$CD(\mathbf{X}) = \mathbf{L}, \mathbf{R}$$
 (1)

s.t. 
$$\mathbf{X} = \mathbf{L} \times \mathbf{R}^T$$
 (2)  
=  $\sum_{i=1}^d L_i \times R_i^T$ 

Where  $d \leq m$  is the number of dimensions to compute.

In this work, we use real world datasets that describe hydrological phenomena of up to 15 million observations produced by sensors in 242 mountain stations. In fact, Our hydrological database contains 79 temperature time series, 69 precipitation time series, 48 water level time series, 15 humidity time series, 4 wind speed time series and 3 air pressure time series. Due the snow met the sensors stop working and produce missing observations in the time series with the following percentages: 20% in temperature, 16% in precipitation, 66% in water level, 6% in humidity, 23% in wind speed and 11% in air pressure.

The aim of this thesis to investigate and implement the Centroid Decomposition method to recover blocks of missing values in time series. The special focus will be to compare the accuracy of the recovery technique using complete hydrological time series and segmented hydrological time series. The segmentation of the time series will be an issue to investigate.

Prof. Dr. Michael Böhlen

Professor Phone +41 44 635 43 33 Fax +41 44 635 68 09 boehlen@ifi.uzh.ch



#### Work tasks:

- 1. Understand and implement the Centroid Decomposition algorithm
- 2. Apply the Centroid Decomposition for the block recovery in hydrological time series. The datasets are already loaded in an Oracle server.
- 3. Review the time series segmentation techniques proposed in the literature
- 4. Implement a segmentation technique for the hydrological time series
- 5. Empirical comparison of the recovery accuracy of the implemented algorithm for complete and segmented time series
- 6. Report that describes the major parts of the work and a presentation in front of the Database Technology Group (15 min)

## Literature:

- 1. Chu, M.T., and Funderlic, R.E., : *The Centroid Decomposition: Relationships Between Discrete Variational Decompositions and SVDs*, in SIAM J. Matrix Analysis and Applications, 2002
- Börzsönyi., E., Recovery of Missing Values based on Centroid decomposition, Master Project, 2013
- 3. Zhang, R., Kotagiri, R. and Parampalli, U., *An Adaptive Algorithm for Online Time Series* Segmentation with Error Bound Guarantee, EDBT, 2012
- 4. Keogh, E., Chu, S., Hart, D., Pazzani, M., *An Online Algorithm for Segmenting Time Series*, ICDM, 2001
- 5. Benjamin, M.M., Missing Data Problems in Machine Learning, PhD thesis, 2008
- 6. De Carli, A., *SQL Implementation of the Centroid Decomposition Method*, Vertiefung Thesis, 2012

Task assignment and supervisor:

• Mourad Khayati (mkhayati@ifi.uzh.ch)

Starting date of thesis: TBD

Ending date of thesis: TBD

University of Zurich Department of Informatics

Prof. Dr. Michael Böhlen Professor