## Khiops CoViz: a tool for visual exploratory analysis of k-coclustering results

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Abstract. Identifying and visually analyzing interesting interactions between variables in large-scale data sets through k-coclustering is of high importance. We present Khiops CoViz<sup>1</sup>, a tool for visual analysis of interesting relationships between two or more variables (categorical and/or numerical). The visualization of k variables coclustering takes the form of a grid/matrix whose dimensions are partitioned: categorical variables are grouped into clusters and numerical variables are discretized. The tool allows several kinds of visualization at various scales for grid representation of coclustering results by means of several criteria each of which providing different insights into the data. Hereafter, several screen shots describe the main visual components of the tool.

| File Tools            |                        | Unfold hierachy | Manage          | views           | J     |           |          |          |             |                                     |             |          |                   |                |           |
|-----------------------|------------------------|-----------------|-----------------|-----------------|-------|-----------|----------|----------|-------------|-------------------------------------|-------------|----------|-------------------|----------------|-----------|
| Ferarchy :            | Event -                |                 | Current Cluster |                 |       |           |          |          | 8.          | Composition of VLDB                 |             |          |                   | search         |           |
| tatistics             | Size : 10              |                 | Current         | Father          | Size  | Frequency | Interest | Hierarch | Rank        | Cluster                             | Terminal    | Rank     | Typicality        | Value          | Frequency |
|                       | Requency : 19231/59547 |                 | CIKM            | C4              | 1     | 9852      | 1        | 1        | 1           | VLDB                                | VLDB        | 3        | 1                 | VLDB           | 10231     |
| -                     | CARGES ( #             |                 | VLDB            | C29             | 1     | 10231     | 0.928019 | 1        | 3           |                                     |             |          |                   |                |           |
| CIRM                  |                        | î               | SIGMOD          | C29             | 1     | 8425      | 0.881104 | 1        | 5           |                                     |             |          |                   |                |           |
| V C16                 |                        | L               | ICDE            | C16             | 1     | 9438      | 0.87679  | 1        | 7           |                                     |             |          |                   |                |           |
| V _ C29               |                        |                 | ICDM            | C9              | 1     | 4957      | 0.742447 | 1        | 9           |                                     |             |          |                   |                |           |
| VLDB                  |                        |                 | KDD             | C22             | 1     | 5907      | 0.752629 | 1        | 11          |                                     |             |          |                   |                |           |
| SIGNO                 |                        |                 | SDM             | C22             | 1     | 2418      | 0.48619  | 1        | 13          |                                     |             |          |                   |                |           |
| orobe                 |                        |                 | PAKDD           | C21             | 1     | 3753      | 0.685157 | 1        | 15          |                                     |             |          |                   |                |           |
| V                     |                        |                 | PKDD            | C21             | 1     | 3566      | 0.657437 | 1        | 17          |                                     |             |          |                   |                |           |
| O COM                 |                        |                 |                 |                 |       |           |          |          |             |                                     |             |          |                   |                |           |
| · _ C18               |                        |                 |                 |                 |       |           |          |          |             |                                     |             |          |                   |                |           |
| * _ C11               |                        |                 |                 |                 |       |           |          |          |             |                                     |             |          |                   |                |           |
| - KDD                 |                        |                 |                 |                 |       |           |          |          |             |                                     |             |          |                   |                |           |
| - COL                 |                        |                 |                 |                 |       |           |          |          |             |                                     |             |          |                   |                |           |
| PANDO                 |                        |                 |                 |                 |       |           |          |          |             |                                     |             |          |                   |                |           |
| warehy :              | Author +               |                 |                 | Current Cluster |       |           |          |          | × -         | Composition of Philip S. Yit, Jawei |             |          | search            |                |           |
| Statistics            | Size : 1114/21077      |                 | Current         | Father          | Size  | Frequency | Interest | Hierarch | Rank        | Cluster                             | Terminal    | Rank     | Typicality        | Value          | Frequency |
|                       | Requency : 10305/50547 |                 | Divesh Sr       | A12             | 1099  | 11667     | 1        | 1        | 1           | Philip S. Y                         | Philip S. Y | 11       | 1                 | Philip S. Yu   | 281       |
| Lunter: s             |                        | Samuel M        | A12             | 3518            | 8558  | 0.958938  | 1        | 3        | Philip S. Y | Philip S. Y                         | 11          | 0.893596 | Jiawei Han        | 258            |           |
| Samuel Madden, xuemi  |                        | W. Bruce        | AT              | 3097            | 5502  | 0.846844  | 1        | 5        | Philip S. Y | Philip S. Y                         | 11          | 0.62347  | Christos Faloutso | 184            |           |
| W Davis Cold, Jama    |                        | Michael S       | A15             | 2320            | 5028  | 0.889185  | 1        | 7        | Philip S. Y | Philip S. Y                         | 11          | 0.39755  | Hans-Peter Kriege | 118            |           |
| w. Bruce Cron, Jame   |                        | Praveen 8       | A15             | 2477            | 3671  | 0.73652   | 1        | 9        | Philip S. Y | Philip S. Y                         | 11          | 0.381692 | Charu C. Aggarwa  | 93             |           |
| Victorio Circolatoria |                        | Philip S. 1     | A14             | 1114            | 10305 | 0.857941  | 1        | 11       | Philip S. Y | Philp S. Y                          | 11          | 0.376802 | Eamonn J. Keogh   | 78             |           |
| Brances Contents M    |                        |                 | Shusaku         | A14             | 2470  | 4639      | 0.815182 | 1        | 13          | Philip S. Y                         | Philip S. Y | 11       | 0.367756          | Jian Pei       | 92        |
| Praveen Sesnaon, Al   |                        |                 | Jie Tang,       | A20             | 2309  | 5755      | 0.816025 | 1        | 15          | Philip S. Y                         | Philip S. Y | 11       | 0.323554          | Habun Wang     | 91        |
|                       |                        |                 | Bhavani k       | A20             | 2673  | 3422      | 0.750937 | 1        | 17          | Philip S. Y                         | Philp S. Y  | 11       | 0.304654          | Jeffrey Xu Yu  | 93        |
| T Alls                |                        |                 |                 | 1111            | 1     |           |          |          |             | Philip S. Y                         | Philip S. Y | 11       | 0.296178          | Wei Fan        | 59        |
| Churchin Termate Harr |                        |                 |                 |                 |       |           |          |          |             | Philip S. Y                         | Philip S, Y | 11       | 0.295035          | Ming-Syan Chen | 81        |
| a musanu isuniuu, nuw |                        |                 |                 |                 |       |           |          |          |             | Philip S. Y                         | Philip S. Y | 11       | 0.286444          | Tao Li         | 61        |
| T ALU                 |                        |                 |                 |                 |       |           |          |          |             | Philip S. Y                         | Philip S. Y | 11       | 0.285875          | Ke Wang        | 85        |
| Jue Tang, Hanghang T  |                        |                 |                 |                 |       |           |          |          | Philip S. Y | Philip S. Y                         | 11          | 0.276702 | Heikki Mannila    | 63             |           |
| 0                     |                        |                 |                 |                 |       |           |          |          |             |                                     |             |          |                   |                |           |

**Fig. 1.** Case study on a examplary sample of DBLP data set. Three-dimensional data  $(Author \times Year \times Event)$  is considered. A screen shot of Khiops CoViz: (from left to right) hierarchies of parts for two dimensions (*Author* and *Event*), list of terminal parts of hierarchies and composition of selected parts.



**Fig. 2.** (Left): Grid/matrix visualization of contribution to mutual information for  $Year \times Event$  dimensions. Other criteria for visualization are available: e.g., contrast, frequency, conditional probability and joint probability... The tool allows navigating along the partition of a selected dimension (e.g., *Author*) while the others (*Year, Event*) are fixed and dedicated to the visualization.



Fig. 3. Choosing the wanted granularity for visualizing the grid is available through the "Unfold Hierarchy" functionality. The user can control either the number of parts of the dimensions or the grid quality (w.r.t. to the optimal grid) by optimal merging or per-dimension customized non-optimal merging.