## PAPER

## Appendix: A transaction transposition for QB

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**SUMMARY** Once we do mining on a top-k relevant images with a very large vocabulary size, we found the patterns may response to several duplicate objects on different images. This leads to a time consuming problem on our mining step. Therefore, a technique called transposition of transaction helps reducing a mining space, which then map the mining result back to the original aspect by using Galois connection through an inverse relationship on a complete lattice. By doing a this, we can save a lot of mining time on any FIM algorithms.

key words: Frequent itemset mining, Visual word mining, Query bootstrapping, Transaction transposition, Galois connection.

## 1. Transaction Transposition for QB

Continue from our paper "Query Bootstrapping", before doing a transaction transposition, we need to check whether our case satisfying the condition said in Galois mapping as follow:

"The mapping f is antitone and there exists an antitone mapping g from P to P' such that the composition mapping are extensive. – (GM)[1]"

Let P and P' are two complete lattices generated from a transaction database T and a transposed transaction  $T^T$ . Using our toy example on a table 1, we then found total patterns of P and P' are isomorphic to each other on the lattice as shown in a Fig. 2.

As we found out our target patterns can be mined from T and will be faster with  $T^T$ , however, the meaning of both pattern results are different. Mining patterns from original transaction database means, we are finding which visual word sets shared among images, where  $p \in P: p = \{i_1, i_2, i_3...i_m\}$ . In contrast, mining patterns from a transposed transaction means, we are finding which images contain similar visual words., where  $p' \in P': p' = \{t_1, t_2, t_3...t_{k'}\}$ . In order to utilize a patterns P', we need a mapping function  $f: P' \to P$  as follow:

$$f(P') = \forall p'_{i',i'} \in P' : \mathbf{A} \tag{1}$$

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c) E-mail: satoh@nii.ac.jp DOI: 10.1587/transinf.E0.D.1  $\begin{array}{|c|c|c|}\hline \text{Img. } I_k & \text{Trans. } t_k \\ \hline I_1 & t_1 = \{i_1, i_2, i_4, i_6\} \\ I_2 & t_2 = \{i_2, i_5, i_8\} \\ I_3 & t_3 = \{i_2, i_3, i_9\} \\ I_4 & t_4 = \{i_1, i_2, i_4, i_7\} \\ I_5 & t_5 = \{i_2, i_3, i_8\} \\ \hline \end{array}$ 

Pattern	support
$\{i_2\}$	60%
$\{i_3\}$	40%
$\{i_8\}$	40%
$\{i_1, i_4\}$	40%
$\{i_3, i_8\}$	20%
$\{i_1, i_4, i_7\}$	20%
$\{i_2, i_3, i_9\}$	20%
$\{i_2, i_5, i_8\}$	20%
$\{i_1, i_2, i_4, i_6\}$	20%

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Table 1: (left) Input simple transactions of top 5 images. (right) Output corresponding patterns found with *minsup* value 10%

where

$$\mathbf{A} = \bigwedge \begin{bmatrix} [T(p'_{1,1}) \wedge T(p'_{1,2}) \wedge \dots \wedge T(p'_{1,k'})]_1 \\ [T(p'_{2,1}) \wedge T(p'_{2,2}) \wedge \dots \wedge T(p'_{2,k'})]_2 \\ \vdots \\ [T(p'_{j',1}) \wedge T(p'_{j',2}) \wedge \dots \wedge T(p'_{j',k'})]_j \end{bmatrix}$$
(2)

and

$$\mathbf{A} = P \tag{3}$$

where P' will be map to P through a transaction T, T(x) will return a set of items on original T, and the total number of patterns on both space will be the same, as ||P'|| = ||P|| or j' = j.

To be more clear on what the function does is that, from the patterns P', we map back each item founded in p', which corresponds to a *transaction id t'*, to an original transaction database T. The actual set of items  $i_m$  on each mapped transaction will be checked to find which item appear on all transactions t'. And such item  $i_m$  will be collected to build p as a mapped pattern from  $p' \rightarrow p$ . In the final sense, we will discover patterns several order of magnitudes faster than a traditional way (see a timing report on both FIM(s) and  $FIM^T(s)$  in our full-paper).

## References

- [1] O. Ore, "Galois connections," Trans. Amer. Math. Soc., 1944.
- [2] "Lattice miner, http://sourceforge.net/projects/lattice-miner/."

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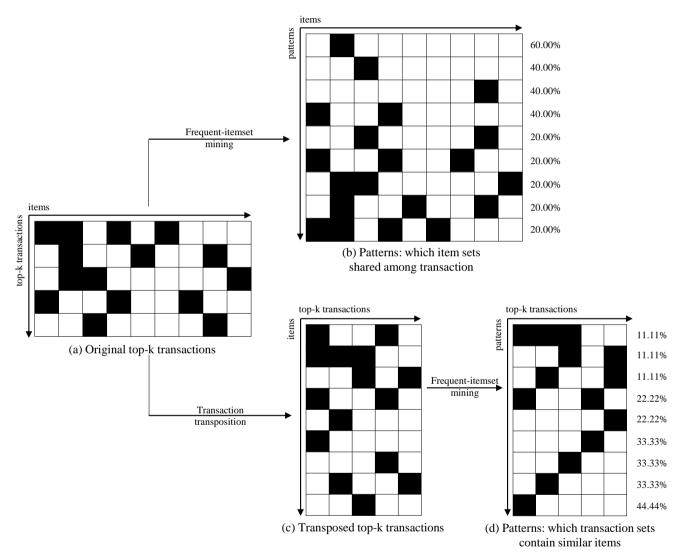


Fig. 1: (a) An original transaction database (T). (c) A transaction database after transposed  $(T^T)$  for speed-up FIM process (b),(d) Patterns (P and P') discovered from FIM using a normal database and a transposed database respectively.

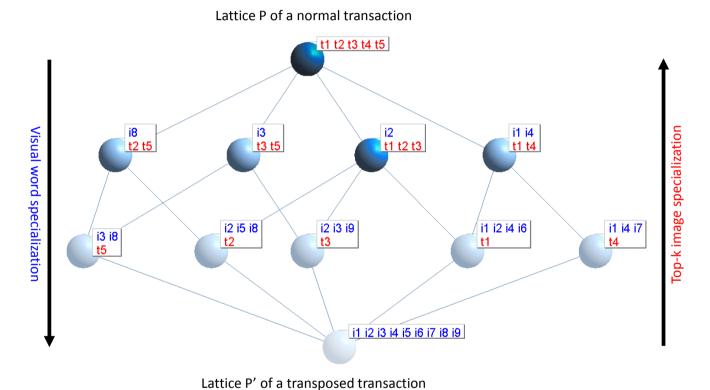


Fig. 2: Two complete lattices $^a$  of (top-down) a toy example transaction database and (bottom-up) a transposed transaction show an isomorphic property which satisfy the Galois mapping condition.

<sup>&</sup>lt;sup>a</sup>The lattices of this toy example is visualized by Lattice Miner. [2]