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(54) Title: MULTI-DIMENSIONAL PATTERN ANALYSIS

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#### (57) Abstract

A pattern recognition method applicable to unique associated pattern recognition in a structured information system or structured database is presented. The process may be used to find patterns in a column which are associated with unique data values in another column, or to find the number of unique values in the second column which are paired with the same associated pattern in the first column. The technique is easily extended to more general cases in which both the condition field and the associated pattern field may be two groups of fields.

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#### MULTI-DIMENSIONAL PATTERN ANALYSIS

#### Field of the Invention

The present invention relates generally to computer databases, including structured information systems and associative memory databases and, in particular, to processes for identifying unique patterns among fields within applicable database structures.

### Background of the Invention

As set forth in commonly assigned U.S. Patent 5,245,337, 5,293,164, and 5,592,667, a multi-10 dimensional approach has been developed for transforming an unstructured information system into a structured information system. This approach addresses the unique properties multiple information source of systems, including database systems, from an information point of 15 view. In particular, this new methodology attempts to unify the two fields of information theory and database by combining the encoding compression theory and the database theory for general data manipulations into a general information manipulation theory with respect to multi-20 dimensional information space.

Broadly, multiple information sources are described by different information variables, each corresponding to one information source or information stream. Information manipulations are primarily index manipulations which are, in general, more efficient than non-index manipulations of the same number. The only non-

index manipulations are carried out at leaf nodes where unique data values are stored. Therefore, the non-index manipulations are minimized. As a further aspect of this approach, a structured information system or database is built by taking into account information relations between different sets of data in the database. Such relations between neighboring nodes are easily analyzed and presented on-line because they are built into the structure. Relations between nodes that are not neighbors are not explicitly built into the existing structure. On-line analysis of these relations requires efficient information manipulations in main memory.

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The approach models multiple information sources as different information variables, wherein each variable corresponds to one information source or information In accordance with the methodology, information stream. variables at leaf nodes of an associative memory database structure assume unique data values. The resulting structured database makes it easy to obtain statistical information about the data stored in the database. However, only a limited amount of statistic information can be readily presented once a given tree structure is built. For example, whereas it is trivial to show double patterns formed from two leaf nodes which happen to be the two child nodes of the same double pattern internal node in an existing tree structure, it is non-trivial to show similar double patterns formed from two leaf nodes that have an immediate common ancestor node which is not a doublepattern node in the existing tree structure.

#### Summary of the Invention

The present invention may be used to solve problems of the type just described in a general way in a structured information system or an associative memory database (AMDB). As one example of many, the process may be used to find patterns in a column which are associated with unique data values in another column, or to find the number of unique values in the second column which are paired with the same associated pattern in the first column. The technique is easily extended, however, to more general cases in which both the condition field and the associated pattern field may be two groups of fields.

more particular sense In a the invention addresses the association of conditional patterns in a field or a single information source with different data values in another field or information source. The first field or information source may be characterized as an associated pattern field, and the second is a condition field. In such a case the invention may be used to determine unique conditional patterns and counts which represent the number of unique data values in the condition field, that are associated with the same unique conditional pattern. The invention finds particular utility in structured information systems, wherein the 25 correspond to leaf nodes of a tree structure.

# Detailed Description of the Invention

This invention resides in the solution to certain classes of problems that occur in structured information

systems, including associative memory databases (AMDBs). One typical, interesting problem adopts the following form: First, assume some patterns exist in a field  $f_1$  or a column, wherein each pattern is associated with a unique data value in a different field  $f_2$ , or each pattern is made up of a set of data values in field  $f_1$ , all of which pair with the same data value in field  $f_2$ . Given this assumption, find out all the unique patterns and counts representative of a unique data value in field  $f_2$  that pairs with the same pattern in  $f_1$ .

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Although it is difficult to identify such patterns, the solution to this problem is quite interesting in many databases. For example, consider an automobile warranty database containing a vehicle ID field and an 15 option code field, where each field value in the option field corresponds to an option associated with a vehicle identified by its vehicle ID. A vehicle may have many different options, and a complete set of options associated with each vehicle ID is an option pattern or option 20 package. The problem here is to determine all the unique option packages and the number of vehicles that have the same pattern or package. Such pattern recognition may help to identify popular packages and to eliminate those unpopular packages or those with low counts from an 25 assembly line.

Broadly, then, problems of this kind have to do with the association of conditional patterns in a field or a single information source with different data values in another field or information source. The first field or

information source may be characterized as an associated pattern field, and the second is a condition field. The goal is to find all the unique conditional patterns and counts which represent the number of unique data values in the condition field, that are associated with the same unique conditional pattern.

To solve the problem, consider two given fields or information sources in an existing tree structure. Assume field a is the condition field and field b is the associated pattern field. In a structured information system, these fields correspond to two leaf nodes, a and b. The difference between the two fields and two leaf nodes is that the two fields are two unstructured information sources which may have redundant information values or data values, and the two leaf nodes are unique information sources which have only unique information values or unique data values.

First, we find the immediate common ancestor node  $n_a$  of the two leaf nodes a and b in the existing tree structure. Assume further that the left child node of the common ancestor node  $n_a$  is  $n_1$ , an ancestor node of node a, but not of node b. Similarly, the right child node  $n_r$  of the ancestor node is an ancestor node of node b, but not of node a.

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Now, we recall the tokens of node a at node  $n_1$ , and recall the tokens of node b at node  $n_r$ . This procedure propagates the a tokens to node  $n_1$  and the b tokens to node  $n_r$ . The memory tokens of node  $n_1$  are replaced by the recalled tokens of node a and the tokens of node  $n_r$  are

replaced by the tokens of node b.

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Next, we load the memory structure of the ancestor node  $n_a$  using the left hashing lists (right hashing lists if the right child node of the common ancestor node is an ancestor node of the condition leaf). In the left hashing structure, a set of lists are built. Each list has a left child token as its list index and stores a set of right child tokens as list elements. Any given list represents pairing between the left child token or the list index and the right child tokens stored in the list.

We replace the list indices by the corresponding tokens of node a and replace the list elements by the corresponding tokens of node b, anticipating some redundant list indices and list elements in the general case. We combine all the lists that have the same list index or that pair with the same token of node a, eliminate redundant elements in each new list, and sort the remaining elements. At this point, we have a set of lists which all have unique list indices. Some lists may store a set of the exact same tokens, although they have different list indices.

Two interesting problems arise here. One is to find out how many unique sets of tokens stored in the lists and what is the number of appearances of each unique set of tokens. To solve this problem, we eliminate identical lists that store the same set of tokens of the leaf node b and keep counting the number of appearances for each unique list. We recall data values of the leaf node b and replace the tokens in each list by the corresponding data values. In this way, we obtain all the unique patterns in field b,

associated with unique data values in field a, and the number of appearances for each unique pattern.

#### EXAMPLES

Assume a database in which one field is user ID identifying a cable TV and another field is option channels specifying optional paid channels associated with each cable TV. Assume there are 100,000,000 records and 20,000,000 different user IDs or cable TVS. The total number of different optional paid channels is 100. On average, each user ID has about 5 paid channels. In the case of conditional pattern recognition, there are some 20,000,000 patterns or packages of optional paid channels. Some patterns may be made of up to 100 optional channels, corresponding to the maximum number of the paid channels each cable TV or user ID can order. Others may have as little as one paid channel.

By virtue of this invention, one might find 10,000 unique patterns of optional channels. On average, each pattern may have counts of 2,000 representing the average number of appearances of each pattern. Some patterns may appear as many times as hundreds of thousands of times or even millions. Others may show up only once. Such patterns of information may help to identify what option packages are popular and what are not. Similarly, one may set phone users who switched phone company to be the condition field and find out what patterns are stored in the hashing lists, associated with each switch specified in the condition field.

It will be appreciated by one of skill in the art that the invention is applicable to a broad range of other problems. To take one further example of many, it may be interesting to find out what is the pattern made up of a set of the left child tokens pairing with the same set of right child tokens or the same right child pattern. This is a pattern-pairing-pattern problem. To solve this problem, one needs to store a set of list indices that correspond to the same set of list elements.

10 I claim:

1. A method of identifying unique data values

- 2 in a structured information system having a pattern field and a condition field, comprising the steps of:
- determining the immediate common ancestor of the pattern field and the condition field;
- 6 recalling the tokens of the two fields;

replacing the field values with the respective

8 recalled tokens;

loading the memory structure of the ancestor node

10 with hashing lists corresponding to the two fields;

building a new set of lists indicative of pairing

- 12 between list indices and child tokens in accordance with the hashing lists; and
- replacing the list indices with the tokens corresponding to the indices.
  - 2. The method of claim 1, further including the 2 steps of:

eliminate redundant elements in each new list;

4 and

sorting the remaining elements.

- 3. The method of claim 1, wherein the
- 2 information system is a tree structure, and the method is used to reveal similar, double patterns formed from two
- 4 leaf nodes that have an immediate common ancestor node which are not a double-pattern node in the existing tree
- 6 structure.

4. In an information system having two fields

- or information sources corresponding to leaf nodes a and b of a tree structure, and wherein the left (or right) child
- 4 node of the common ancestor node  $n_a$  is  $n_1$ , and an ancestor node of node a, but not of node b, and the right (or left)
- 6 child node  $n_{\rm r}$  of the ancestor node is an ancestor node of node b, but not of node a, a method of rearranging the
- 8 structure to perform certain query operations, comprising
  the steps of:
- locating the immediate common ancestor node  $n_{\mbox{\tiny a}}$  of the two leaf nodes a and b;
- recalling the tokens of node a at node  $n_{\scriptscriptstyle 1}$  and recalling the tokens of node b at node  $n_{\scriptscriptstyle r}$ , thereby
- 14 propagating the a tokens to node  $n_{\rm l}$  and the b tokens to node  $n_{\rm r}$ ;
- replacing the memory tokens of node  $n_1$  with the recalled tokens of node a and replacing the tokens of node
- 18  $n_r$  with the tokens of node b;
  - loading the memory structure of the ancestor node
- 20  $\, n_{\scriptscriptstyle a} \,$  using the left or right hashing lists, as appropriate;
  - building a set of lists corresponding to the left
- 22 hashing structure, such that any given list represents pairing between the left child token or the list index and
- 24 the right child tokens stored in the list, wherein each list has a left child token as its list index and stores a
- 26 set of right child tokens as list elements;
  - replacing the list indices by the corresponding
- 28 tokens of node a and replace the list elements by the corresponding tokens of node b;

combining all the lists that have the same list index or that pair with the same token of node a, thereby eliminate redundant elements in each new list; and sorting the remaining elements.

- 5. The method of claim 4, further including the 2 step of eliminating identical lists that store the same set of tokens of the leaf node b while storing the number of 4 appearances for each unique list;
- recalling data values of the leaf node b; and replacing the tokens in each list by the corresponding data values.

# INTERNATIONAL SEARCH REPORT

International application No.
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A. CLASSIFICATION OF SUBJECT MATTER  IPC(6) :G06F 17/30						
US CL: 707/2 According to International Patent Classification (IPC) or to both national classification and IPC						
	DS SEARCHED	national classification and IPC				
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U.S. :	707/1,2,3,6					
Documentat	tion searched other than minimum documentation to the	extent that such documents are included	in the fields searched			
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	DIALOG ms: analysis, identify, statistic, pattern, data, database	, field, column, mining				
C. DOC	CUMENTS CONSIDERED TO BE RELEVANT					
Category*	Citation of document, with indication, where ap	propriate, of the relevant passages	Relevant to claim No.			
AP	US 5,809,499 A (WONG et al) 15 Sep	1-5N				
ΑE	US 5,832,182 A (ZHANG et al) 3 No	1-5				
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