

## Introduction

- :: Bělohávek and Vychodil [1, 2, 3] proposed generalization of the Codd's relational database model
- :: allows similarity based queries (find a car which costs about \$10,000)
- :: each tuple (row in the table) has a rank indicating the degree to which tuple satisfies the given query
- :: solid theoretical foundations: relational algebra and calculus

## Our Goal

- Create a query language which
- :: corresponds to the theoretical model,
- :: is independent of the physical implementation,
- :: allows for implicit query optimizations,
- :: is suitable for database practitioners.

## Data Model

### Scale of Truth Degrees

- :: complete residuated lattice:  $\mathbf{L} = \langle L, \wedge, \vee, \otimes, \rightarrow, 0, 1 \rangle$
- ::  $\langle L, \wedge, \vee, 0, 1 \rangle$  is a complete lattice with 0 and 1 being the least and greatest element of  $L$
- ::  $\langle L, \otimes, 1 \rangle$  is a commutative monoid
- ::  $\otimes$  and  $\rightarrow$  satisfy so-called adjointness property:  
 $a \otimes b \leq c$  iff  $a \leq b \rightarrow c$  for each  $a, b, c \in L$
- :: used by domain similarities and ranks (degrees of matches)

### Example

- ::  $L = [0, 1]$
- ::  $a \otimes b = \max(0, a + b - 1)$
- ::  $a \rightarrow b = \min(1, 1 - a + b)$

- [1] Belohlavek, Vychodil: Data tables with similarity relations: functional dependencies, complete rules and non-redundant bases. In: DASFAA 2006, LNCS 3882, pp. 644–658 (2006)
- [2] Belohlavek, Vychodil: Query systems in similarity-based databases: logical foundations, expressive power, and completeness. In: ACM SAC 2010, pp. 1648–1655 (2010)
- [3] Belohlavek, Vychodil: Codd's relational model from the point of view of fuzzy logic. J. Logic and Computation 21:851–862 (2011)

## Ranked Data Table

- :: ranked data tables (shortly, RDTs) are counterparts to the ordinary data tables in the original Codd's model
- :: RDTs represent stored data and results of similarity-based queries where tuples are allowed to match conditions to degrees

### Definitions

- :: nonempty set  $Y$  of attributes – names of columns
- :: finite subset  $R \subseteq Y$  is called a **relation scheme** (heading of the table)
- :: each attribute  $y \in Y$  has its **domain**  $D_y$  (set of attribute's values)
- :: having a scale of truth degrees,  $L$  each domain  $D_y$  can be equipped with a map  $\approx_y: D_y \times D_y \rightarrow L$ , called a **similarity**, satisfying conditions of reflexivity and symmetry:

$$(i) \approx_y(u, u) = 1 \text{ for all } u \in D_y;$$

$$(ii) \approx_y(u, v) = \approx_y(v, u) \\ \text{for all } u, v \in D_y$$

- ::  $u \approx_y v$  is interpreted as a degree to which  $u \in D_y$  is similar to  $v \in D_y$

- :: **cartesian product** of domains  $D_y$  ( $y \in R$ ), denoted by  $\prod_{y \in R} D_y$ , is a set of all maps  $r: R \rightarrow \prod_{y \in R} D_y$  such that  $r(y) \in D_y$  for all  $y \in R$

- :: each  $r \in \prod_{y \in R} D_y$  shall be called a **tuple** on  $R$  over domains  $D_y$  ( $y \in R$ )

- :: a **ranked data table** on  $R$  over domains  $D_y$  with similarities  $\approx_y$  ( $y \in R$ ) is any map

$$\mathcal{D}: \prod_{y \in R} D_y \rightarrow L$$

such that there are at most finitely many tuples  $r$  such that  $\mathcal{D}(r) > 0$ .

- :: the degree  $\mathcal{D}(r)$  assigned to tuple  $r$  by  $\mathcal{D}$  shall be called a **rank** of tuple  $r$  in  $\mathcal{D}$

### Remarks

- :: attributes from  $R$  denote table columns, values from  $D_y$  are table entries
- :: order of tuples and columns does not matter

## RESIQL

- :: Relational Similarity-based Query Language
- :: all queries are expressions—either **scalar** or **relational** (evaluate to an RDT; consist of relational operators and variables)

- :: expressions are evaluated with the RETRIEVE command

### Restrictions

- :: relational operator:  $\mathcal{D}$  WHERE  $E$
- ::  $\mathcal{D}$  is a relational expression evaluating to an RDT  $\mathcal{D}$  and  $E$  is a condition
- :: returns an RDT which for each tuple  $r$  in  $\mathcal{D}$  contains the tuple  $r$  with rank

$$\mathcal{D}(r) \otimes \|E\|_r$$

- ::  $\|E\|_r$  denotes the degree to which  $r$  satisfies  $E$

- :: if the rank of the tuple is 0, the tuple is omitted

### Projections, Renamings, Extensions

- :: relational operator:  $[spec_1, \dots, spec_n \text{ FROM } \mathcal{D}]$
- ::  $\mathcal{D}$  is a relational expression, each  $spec_i$  is a scalar expression, optionally along with the AS keyword assigning a name to an attribute
- :: for each tuple  $r$  computes new tuple using  $spec_1, \dots, spec_n$
- :: if duplicate tuples appear, only one tuple is preserved (supremum of their ranks is used as its rank)
- :: relational operator:  $\mathcal{D}$  AS *prefix*
- :: auxiliary operator which renames all attributes of the RDT

- :: adds *prefix* and a dot to each attribute

### Joins

- :: relational operator:  $\mathcal{D}_1$  CROSS JOIN  $\mathcal{D}_2$
- ::  $\mathcal{D}_1, \mathcal{D}_2$  are relational expressions evaluating to RDTs  $\mathcal{D}_1, \mathcal{D}_2$  and  $\mathcal{D}_1$  and  $\mathcal{D}_2$  are RDTs on disjoint relation schemes  $R_1$  and  $R_2$
- :: result is an RDT whose relation scheme is set-theoretic union of  $R_1$  and  $R_2$
- :: the rank of each tuple  $r = r_1 r_2$  in the cross join is the result of  $\mathcal{D}_1(r_1) \otimes \mathcal{D}_2(r_2)$

## Examples

### Pruning Operators

- :: relational operators:  $\mathcal{D}$  ABOVE  $a$ ,  $\mathcal{D}$  TOP  $n$
- ::  $\mathcal{D}$  is a relational expression which evaluates to  $\mathcal{D}$
- ::  $a$  is a scalar expression evaluating to a rank,  $n$  is a scalar expression evaluating to a positive integer
- :: ABOVE returns an RDTs with tuples having rank  $\geq a$
- :: TOP returns an RDT containing  $n$  tuples with the highest ranks
- :: remaining tuples having the same rank as tuples among those  $n$  tuples with the highest ranks are also included

### Examples

- :: data tables *cars* and *customers* used in examples

	name	price	type	year
1.00	BMW X5	12500	SUV	2004
1.00	Ford Fiesta	11560	Wagon	2011
1.00	Ford Focus	9811	Hatchback	2011
1.00	Honda Accord	10600	Wagon	2010
1.00	Hyundai i30	11699	Hatchback	2010

	customer	price	type
1.00	Adams	10000	Hatchback
1.00	Black	12000	SUV
0.70	Black	11000	Wagon

- :: query: "Find a hatchback for about 11,500 or less"
- RETRIEVE *cars* WHERE *type*  $\approx_{type}$  'Hatchback'  
 $\otimes$  (*price*  $\approx_{price}$  11500  $\vee$  *price* < 11500);

	name	price	type	year
1.00	Ford Focus	9811.0	Hatchback	2011
0.80	Hyundai i30	11699.0	Hatchback	2010
0.50	Honda Accord	10600.0	Wagon	2010
0.44	Ford Fiesta	11560.0	Wagon	2011

- :: an example of a complex query matching available cars to customers' demands

RETRIEVE [ *c.name* AS *name*, *c.price* AS *price*,  
*cust.customer* AS *customer*,  
*c.price* - *cust.price* AS *difference*  
FROM *cars* AS *c* CROSS JOIN *customers* AS *cust*  
WHERE ((*c.price*  $\approx_{price}$  *cust.price*)  $\vee$  (*c.price*  $\leq$  *cust.price*))  
 $\otimes$  (*c.type*  $\approx_{type}$  *cust.type*) ] TOP 4;

	name	customer	price	difference
1.00	Ford Focus	Adams	9811	-189
0.70	Honda Accord	Black	10600	-400
0.50	BMW X5	Black	12500	500
0.49	Ford Fiesta	Black	11560	-440
0.49	Honda Accord	Black	10600	-1400