# Introduction to Database Systems

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#### Content

- Motivation
- Functional dependencies
  - Armstrong's axioms
  - Closure of a set of attributes
  - Key
  - Minimal non-redundant functional dependencies

### Database Scheme Design

- There is a lot of ways how to design a database scheme corresponding to a particular assignment
- Some solutions are comparably good, others are considerably worse
- There exists an elegant theory for the database design

- We want to store this information:
  - name of customer and his/her email, which products he/she bought and how much they cost
- Purchase(cName, email, pID, pCathegory, pLabel, when, price)

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cName	email	pID	pKat.	pLabel	when	price
Radim	Radim.B@vsb.cz	1	cleaner	Electrolux	1.8.2012	520
Jack	jack@theripper.cz	1	cleaner	Electrolux	3.9.2012	500
Radim	Radim.B@vsb.cz	5	toothpick	GlobalWood	2.11.2012	6

- When designing a scheme, so-called anomalies can emerge:
  - anomaly during an update
  - anomaly during a deletion



- Anomalies can result in an inconsistent database
- Anomalies are caused mainly by a relation redundancy

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# Example - A Good Design

- Linear notation of the scheme:
  - Customer (cName, email)
  - Purchase (cName, pID, price, when)
  - Product(pID, pCathegory, pLabel)
- Each customer and each product are only once in the databse

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- Each customer and each product are only once in the databse
- Redundancy can be noticed in repeating foreign keys (for different records), but the consistency of keys is checked by a database system

- Purchase (cName, email, pID, pCathegory, pLabel, when, price)
- Values in the relation have certain relationship: cName, email
- If two different records in the Purchase relation have the same email, they both correspond the same customer
- We denote: email → cName
   and we say that the cName attribute is functionally dependent on
   the email attribute

- Movie (name, year, length, director)
- Not only pairs of attributes can be functionally dependent
- Generally, a movie is uniquely determined by its name and year (this has been observed on IMDB's real-world data)
- ullet So we can write: name, year o length, director

Name	Year	Length	Director
Happiness	1965	79	Agnes Varda
Happiness	1998	140	Todd Solondz
American History X	1998	119	Tony Kaye

# Functional Dependency (FD) - Definition

A formal definition of a FD:

$$\forall u, v \in R :$$
  
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- We write:  $A_1, \ldots, A_n \to B_1, \ldots, B_n$ , abbreviated as  $\overline{A} \to \overline{B}$
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# Functional Dependency (FD) - Other Concepts

- A dependency  $\overline{A} \to \overline{B}$  is said to be
  - trivial if  $\overline{B} \subset \overline{A}$
  - non-trivial if  $\overline{B} \not\subset \overline{A}$
  - totally non-trivial if  $\overline{B} \cap \overline{A} = \emptyset$

# **Armstrong's Axioms**

- There are certain deriving rules for functional dependencies
- These are often called Armstrong's axioms:
  - decomposition
  - union
  - transitivity
  - augmentation

# Decomposition of a FD

• Consider  $\overline{A} \to B_1, \dots, B_n$ 

$$\begin{array}{c} \Downarrow \\ \overline{A} \rightarrow B_1 \\ \overline{A} \rightarrow B_2 \\ \vdots \\ \overline{A} \rightarrow B_n \end{array}$$

- We say that the FD  $\overline{A} \to B_1, \dots, B_n$  is decomposed into elementary FDs, i.e., those having only one attribute on the right hand side
- Can we decompose the left side of a FD?

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#### Union of FDs

• Consider 
$$\overline{A} \to B_1$$
  
 $\overline{A} \to B_2$   
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### Augmentation of a FD

• Consider  $\overline{A} \to \overline{B}$ 

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 $\overline{AZ} \to \overline{BZ}$  for any set Z

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### Transitivity of FDs

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$$\overline{B} \to \overline{C}$$

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#### Closure of a Set of Attributes

- Consider a scheme R, a set of FDs, and attributes  $\overline{A} \subset R$
- Find a set of all attributes  $\overline{B} \subset R$  satisfying  $\overline{A} \to \overline{B}$
- The set  $\overline{B}$  is called a closure of  $\overline{A}$  and is denoted by  $\overline{A}+$

# Closure - Algorithm

- Consider a scheme R, a set of FDs, and attributes  $\overline{A} \subset R$
- Find  $\overline{A}$ + (i.e., a closure of the  $\overline{A}$  set)
- Algorithm:

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\overline{X} = \overline{A};
while \overline{X} is modified do

if there is a dependency \overline{Y} \to \overline{B}, where \overline{Y} \subset \overline{X} then

add \overline{B} into X;
end
\overline{A} + = \overline{X};
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$$\{A \rightarrow D, AC \rightarrow B, D \rightarrow C, B \rightarrow E\}$$

- 1)  $\overline{X} = \{A\}$
- 2)  $X = \{A, D\}, (A \to D)$
- 3)  $\overline{X} = \{A, D, C\}, (D \rightarrow C)$
- 4)  $\overline{X} = \{A, D, C, B\}, (AC \rightarrow B)$
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# Key

- A set of attributes  $K \subset R$  is a key of R if all attributes of the scheme are functionally dependent on K
- So if  $K \rightarrow$  all attributes of R
- Usually there is, moreover, stated that there is no subset of K (different from K) which is a key of R

# **Key and Closure**

- Consider  $\overline{A} \subset R$  and find out if this is a key of R
- We solve this problem by finding a closure of  $\overline{A}$
- If the closure  $\overline{A}$ + involves all attributes of R, then  $\overline{A}$  is a key of R

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# How to Find a Key?

- We want to find all keys for a given set of FDs
- Theoretically, we should determine a closure of every subset of attributes
- Practically, we start with the shortest subsets and proceed to longer ones
- After we find some key, we do not have to test supersets of this key since they will be keys too

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#### Minimal Non-redundant FDs

- The goal is: to find a minimal set of totally non-trivial and non-redundant FDs such that all FDs for the relational scheme are implied by this set
- When determining a set of FDs for some scheme, we usually intuitively create a set satisfying this condition
- In the following slides, we introduce a technique how to find this set

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#### Redundant FDs

- Having a set F of FDs, we want to determine if  $\overline{A} \to B$  is implied by F (i.e., if  $\overline{A} \to B$  is a redundant FD)
- Note that B is a single attribute (we deal with an elementary FD)
   every set of FDs can be easily decomposed by using
   Armstrong's decomposition rule into a set of elementary FDs
- Basically, we have two options how to resolve this problem:
  - to determine a closure of A by using the rules from F; if the closure involves B, then the dependency  $\overline{A} \to B$  is redundant
  - to derive  $\overline{A} \to B$  directly from F by using Armstrong's axioms

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- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
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- We proceed with the rule X → Z:
  - The remaining FDs are  $\{X \to Y, Y \to X, Y \to Z\}$
  - X+ = {X, Y, Z}, which contains Z, so that the rule is redundant
  - It can be noticed that the rule X → Z can be derived from X → Y and Y → Z by using transitivity
  - The set of FDs without  $X \to Z$  is already non-redundant (it can be shown analogously)

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- The last rule is  $Y \rightarrow Z$ :
  - The remaining FDs are  $\{X \rightarrow Y, X \rightarrow Z, Y \rightarrow X\}$
  - $\overline{Y}$ + = {X, Y, Z}, which contains Z, so that the rule is redundant
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- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- So the result is that we have two non-redundant sets of FDs:

#### Removal of Redundant Attributes

- In the previous example, we have shown how to remove FDs
- To obtain a set of FDs as small as possible, it is necessary to remove redundant attributes on the left hand side of FDs
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- Consider R(A, B, C, D, E) and this set of FDs: {ABC → D, E → C, AB → E, C → D}. Remove redundant attributes.
- Let us check only this FD: ABC → D
- First we obtain that  $ABC+=\{A,B,C,D,E\}$
- Then we determine the closures  $BC+=\{B,C,D\}$ ,  $AC+=\{A,C,D\}$ , and  $AB+=\{A,B,C,D,E\}$
- Evidently, the C attribute is redundant since ABC+=AB+
- So the result is this set of FDs  $\{AB \rightarrow DE, E \rightarrow C, C \rightarrow D\}$

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- Then we determine the closures  $BC + = \{B, C, D\}$ ,  $AC + = \{A, C, D\}$ , and  $AB + = \{A, B, C, D, E\}$
- Evidently, the C attribute is redundant since ABC+=AB+
- So the result is this set of FDs:  $\{AB \rightarrow DE, E \rightarrow C, C \rightarrow D\}$

- Consider R(A, B, C, D, E) and this set of FDs: {ABC → D, E → C, AB → E, C → D}. Remove redundant attributes.
- Let us check only this FD:  $ABC \rightarrow D$
- First we obtain that  $ABC+=\{A,B,C,D,E\}$
- Then we determine the closures  $BC + = \{B, C, D\}$ ,  $AC + = \{A, C, D\}$ , and  $AB + = \{A, B, C, D, E\}$
- Evidently, the C attribute is redundant since ABC+=AB+
- So the result is this set of FDs:  $\{AB \rightarrow DE, E \rightarrow C, C \rightarrow D\}$

#### References

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