# Database systems I

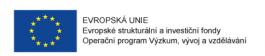
Radim Bača

radim.baca@vsb.cz

VSB TECHNICAL FACULTY O UNIVERSITY ENGINEER SCIENCE

FACULTY OF ELECTRICAL
ENGINEERING AND COMPUTER
SCIENCE

DEPARTMENT OF COMPUTER SCIENCE





#### 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)

- 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)

Purchase (cName, email, pID, pCathegory, pLabel, when, price)

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

Purchase (cName, email, pID, pCathegory, pLabel, when, price)

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

## 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

## 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
- 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)
- Attributes 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 ightarrow 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:

$$\forall u, v \in R :$$
  
 $u[A_1, ..., A_n] = v[A_1, ..., A_n] \Rightarrow$ 

# Functional Dependency (FD) - Definition

A formal definition of a FD:

$$\forall u, v \in R : u[A_1, ..., A_n] \Rightarrow u[B_1, ..., B_n] = v[B_1, ..., B_n]$$

- We write:  $A_1, \ldots, A_n \to B_1, \ldots, B_n$ , abbreviated as  $\overline{A} \to \overline{B}$
- Functional dependencies represent a concept enabling us to correctly define database schemes
- They can also have other importances

# Functional Dependency (FD) - Definition

A formal definition of a FD:

```
\forall u, v \in R : u[A_1, ..., A_n] \Rightarrow u[B_1, ..., B_n] = v[B_1, ..., B_n]
```

- We write:  $A_1, \ldots, A_n \to B_1, \ldots, B_n$ , abbreviated as  $\overline{A} \to \overline{B}$
- Functional dependencies represent a concept enabling us to correctly define database schemes
- They can also have other importances

# 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  $\overline{A} \to B_1, \dots, B_n$ 

$$\frac{\downarrow}{\overline{A}} \to B_1$$

$$\overline{A} \to B_2$$

$$\vdots$$

$$\overline{A} \to B_n$$

- 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?

### Decomposition of a FD

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

$$\frac{\overline{A}}{\overline{A}} \to B_1$$

$$\overline{A} \to B_2$$

$$\vdots$$

$$\overline{A} \to B_n$$

- 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?

### Union of FDs

• Consider 
$$\overline{A} \to B_1$$
  
 $\overline{A} \to B_2$   
 $\vdots$   
 $\overline{A} \to B_n$   
 $\downarrow \downarrow$   
 $\overline{A} \to B_1, \dots, B_n$ 

### Union of FDs

• Consider 
$$\overline{A} \to B_1$$
  
 $\overline{A} \to B_2$   
 $\vdots$   
 $\overline{A} \to B_n$   
 $\downarrow \downarrow$   
 $\overline{A} \to B_1, \dots, B_n$ 

## Augmentation of a FD

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



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

## Augmentation of a FD

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

 $\downarrow$ 

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

## Transitivity of FDs

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



$$\overline{A} \rightarrow \overline{C}$$

### Transitivity of FDs

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

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

$$\Downarrow$$

$$\overline{A} \to \overline{C}$$

#### 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:

```
X=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};
```

## 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:

Find A+ for the scheme R(A, B, C, D, E) and this set of FDs:

```
\{A \rightarrow D, AC \rightarrow B, D \rightarrow C, B \rightarrow E\}
```

- 1)  $\overline{X} = \{A\}$
- 2)  $\overline{X} = \{A, D\}, (A \rightarrow D)$
- 3)  $\overline{X} = \{A, D, C\}, (D \rightarrow C)$
- 4)  $\overline{X} = \{A, D, C, B\}, (AC \rightarrow B)$
- 5)  $\overline{X} = \{A, D, C, B, E\}, (B \rightarrow E)$
- 6) A+=X



• Find A+ for the scheme R(A, B, C, D, E) and this set of FDs:  $\{A \rightarrow D, AC \rightarrow B, D \rightarrow C, B \rightarrow E\}$ 

1) 
$$\overline{X} = \{A\}$$

2) 
$$\overline{X} = \{A, D\}, (A \rightarrow D)$$

3) 
$$\overline{X} = \{A, D, C\}, (D \rightarrow C)$$

4) 
$$\overline{X} = \{A, D, C, B\}, (AC \rightarrow B)$$

5) 
$$\overline{X} = \{A, D, C, B, E\}, (B \rightarrow E)$$

6) 
$$A+=X$$



• Find A+ for the scheme R(A, B, C, D, E) and this set of FDs:

$$\{A \rightarrow D, AC \rightarrow B, D \rightarrow C, B \rightarrow E\}$$

- 1)  $\overline{X} = \{A\}$
- 2)  $\overline{X} = \{A, D\}, (A \rightarrow D)$
- 3)  $\overline{X} = \{A, D, C\}, (D \rightarrow C)$
- 4)  $\overline{X} = \{A, D, C, B\}, (AC \rightarrow B)$
- 5)  $\overline{X} = \{A, D, C, B, E\}, (B \rightarrow E)$
- 6) A + = X



• Find A+ for the scheme R(A, B, C, D, E) and this set of FDs:  $\{A \rightarrow D, AC \rightarrow B, D \rightarrow C, B \rightarrow E\}$ 

- 1)  $\overline{X} = \{A\}$
- 2)  $\overline{X} = \{A, D\}, (A \rightarrow D)$
- 3)  $\overline{X} = \{A, D, C\}, (D \rightarrow C)$
- 4)  $\overline{X} = \{A, D, C, B\}, (AC \rightarrow B)$
- 5)  $\overline{X} = \{A, D, C, B, E\}, (B \to E)$
- 6) A+=X

• Find A+ for the scheme R(A, B, C, D, E) and this set of FDs:  $\{A \rightarrow D, AC \rightarrow B, D \rightarrow C, B \rightarrow E\}$ 

1) 
$$\overline{X} = \{A\}$$

2) 
$$\overline{X} = \{A, D\}, (A \rightarrow D)$$

3) 
$$\overline{X} = \{A, D, C\}, (D \rightarrow C)$$

4) 
$$\overline{X} = \{A, D, C, B\}, (AC \rightarrow B)$$

5) 
$$\overline{X} = \{A, D, C, B, E\}, (B \rightarrow E)$$

6) 
$$A+=X$$

• Find A+ for the scheme R(A, B, C, D, E) and this set of FDs:

$$\{A \rightarrow D, AC \rightarrow B, D \rightarrow C, B \rightarrow E\}$$

- 1)  $\overline{X} = \{A\}$
- 2)  $\overline{X} = \{A, D\}, (A \rightarrow D)$
- 3)  $\overline{X} = \{A, D, C\}, (D \rightarrow C)$
- 4)  $\overline{X} = \{A, D, C, B\}, (AC \rightarrow B)$
- 5)  $\overline{X} = \{A, D, C, B, E\}, (B \rightarrow E)$
- 6) A+=X



• Find A+ for the scheme R(A, B, C, D, E) and this set of FDs:

```
\{A \rightarrow D, AC \rightarrow B, D \rightarrow C, B \rightarrow E\}
```

- 1)  $\overline{X} = \{A\}$
- 2)  $\overline{X} = \{A, D\}, (A \rightarrow D)$
- 3)  $\overline{X} = \{A, D, C\}, (D \rightarrow C)$
- 4)  $\overline{X} = \{A, D, C, B\}, (AC \rightarrow B)$
- 5)  $\overline{X} = \{A, D, C, B, E\}, (B \rightarrow E)$
- 6)  $A+=\overline{X}$



## 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  $K \to \text{all attributes of } R$
- 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

# 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

# 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, there are two facts that substantially limit the number of possible subsets:
  - 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
  - If there is no FD having attribute A on a left side

# 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, there are two facts that substantially limit the number of possible subsets:
  - 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
  - If there is no FD having attribute A on a left side

#### 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

#### 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

#### 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

#### 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  $\overline{A}$  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

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- We can pick every elementary FD and try to find out if it is redundant

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- We can pick every elementary FD and try to find out if it is redundant
- Let is start with X → Y:
  - The remaining FDs are  $\{X \to Z, Y \to X, Y \to Z\}$
  - $\overline{X}$ + = {X, Z}, which does not contain Y, so that the rule is not redundant

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- We can pick every elementary FD and try to find out if it is redundant
- Let is start with X → Y:
  - The remaining FDs are  $\{X \to Z, Y \to X, Y \to Z\}$
  - $\overline{X}$ + = {X, Z}, which does not contain Y, so that the rule is not redundant

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, \mathbf{X} \to \mathbf{Z}, Y \to X, Y \to Z\}$
- We proceed with the rule X → Z:
  - The remaining FDs are  $\{X \to Y, Y \to X, Y \to Z\}$
  - $\overline{X}$ + = {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)

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

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

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- Let us examine the rule Y → X:
  - The remaining FDs are  $\{X \rightarrow Y, X \rightarrow Z, Y \rightarrow Z\}$
  - $\overline{Y}$  + = { Y , Z }, which does not contain X , so that the rule is not redundant

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- Let us examine the rule Y → X:
  - The remaining FDs are  $\{X \rightarrow Y, X \rightarrow Z, Y \rightarrow Z\}$
  - $\overline{Y}$ + = {Y, Z}, which does not contain X, so that the rule is not redundant

- Consider R(X, Y, Z) and this set of FDs:  $\{X \rightarrow YZ, Y \rightarrow XZ\}$ . Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- 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
  - This rule can be again derived by using transitivity

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- 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
  - This rule can be again derived by using transitivity

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- We create a set of elementary FDs:  $\{X \to Y, X \to Z, Y \to X, Y \to Z\}$
- 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
  - This rule can be again derived by using transitivity

- Consider R(X, Y, Z) and this set of FDs: {X → YZ, Y → XZ}.
   Determine non-redundant set of FDs.
- 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
- If  $\overline{A} \to \overline{B}$  and for a  $C \in \overline{A}$  it holds that  $(\overline{A} C) + = \overline{A} +$ , then the C attribute is redundant for this FD

#### 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
- If  $\overline{A} \to \overline{B}$  and for a  $C \in \overline{A}$  it holds that  $(\overline{A} C) + = \overline{A} +$ , then the C attribute is redundant for this FD

#### 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
- If  $\overline{A} \to \overline{B}$  and for a  $C \in \overline{A}$  it holds that  $(\overline{A} C) + = \overline{A} +$ , then the C attribute is redundant for this FD

- 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:  $\{AB \rightarrow DE, E \rightarrow C, C \rightarrow D\}$

- 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:  $\{AB \rightarrow DE, E \rightarrow C, C \rightarrow D\}$

- 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:  $\{AB \rightarrow DE, E \rightarrow C, C \rightarrow D\}$

- 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:  $\{AB \rightarrow DE, E \rightarrow C, C \rightarrow D\}$



- 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:  $\{AB \rightarrow DE, E \rightarrow C, C \rightarrow D\}$



- 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

- Jennifer Widom. Introduction to Databases.
   https://www.coursera.org/course/db
- Course home pages http://dbedu.cs.vsb.cz

