

# Data Modelling/Data Base Systems

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Relational Design Theory – Functional Dependencies

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# Acknowledgements

The slides are based on the slides (in German) of [Sebastian Skritek](#).

The content is based on [Chapter 6](#) of  
(Kemper, Eickler: Datenbanksysteme – Eine Einführung).

For related literature in English see [Chapter 19](#) of  
(Ramakrishnan, Gehrke: Database Management Systems).

# Overview

- 1 Overview
- 2 Aims
- 3 Functional Dependencies
  - Definitions
  - Canonical Cover
- 4 Design Theory and Decomposition
  - “Bad” Relational Schemata
  - Decomposition of Relational Schemata
  - Criteria for a “meaningful” decomposition
- 5 Normalforms (1., 2., 3., Boyce-Codd)
  - Normalization through Synthesis Algorithm
  - Normalization through Decomposition

# Aims

- fine-tuning of the relational schema
- quality of a relational schema:
  - satisfying consistency conditions
  - avoidance of redundancies
- modelling with data dependencies
  - **functional dependencies**
  - inclusion dependencies
  - compound dependencies

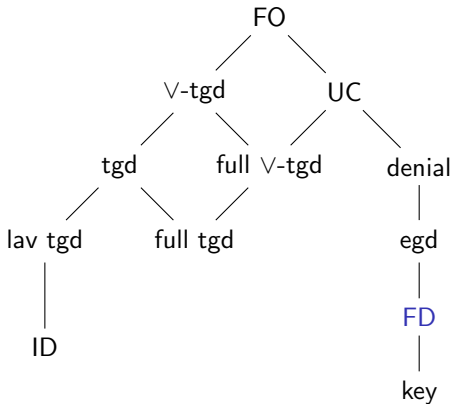
# Aims

- basis: **functional dependencies (FDs)**
  - motivation
  - definition
  - determination
  - closure
  - canonical cover
  - key
- **normalforms** as quality criterion
- possible improvement of the relational schema
  - synthesis algorithm
  - decomposition

# Functional Dependencies

- motivation
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# Integrity Constraints: an Essential DB-Tool



# Application of Functional Dependencies

## advantages of functional dependencies:

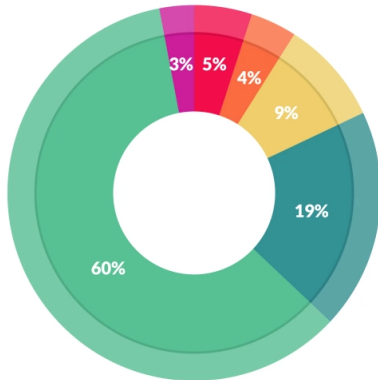
- simple semantics
- many problems are efficiently computable

## use of functional dependencies for/in:

- consistency conditions for data bases
- determination of the quality of relational schemata
- “data exchange” and “data integration”
- “data cleaning”
- . . .



# Application: Data Cleaning

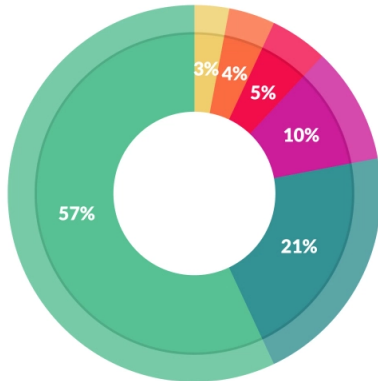


What data scientists spend the most time doing

- Building training sets: 3%
- Cleaning and organizing data: 60%
- Collecting data sets; 19%
- Mining data for patterns: 9%
- Refining algorithms: 4%
- Other: 5%

(Forbes, May 2016)  
(Thanks to Emanuel Sallinger)

# Application: Data Cleaning



What's the least enjoyable part of data science?

- Building training sets: 10%
- Cleaning and organizing data: 57%
- Collecting data sets: 21%
- Mining data for patterns: 3%
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# Overview

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# Functional Dependencies – Notation

## Notation:

- **schema**  $\mathcal{R} = \{A, B, C, D, \dots, H\}$
- **attribute**:  $A, B, C, \dots$  attribute sets:  $\alpha, \beta, \dots$
- **relation**:  $R$ , tuple:  $r, s, t, \dots$  projection:  $r.\alpha, t.\beta, \dots$
- set difference (for  $a \in \mathcal{A}$ ):  $\mathcal{A} - a$  instead of  $\mathcal{A} \setminus \{a\}$

# Functional Dependencies

## Definition (functional dependencies)

Let  $\mathcal{R}$  be a relational schema and  $\alpha \subseteq \mathcal{R}, \beta \subseteq \mathcal{R}$ .

A functional dependency (FD) is a relationship  $\alpha \rightarrow \beta$ .

“ $\alpha$  determines  $\beta$ ”

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## Definition (semantics of functional dependencies)

A relation  $R$  satisfies a **functional dependency (FD)**  $\alpha \rightarrow \beta$  if and only if for all tuples  $r, t \in R$  with  $r.\alpha = t.\alpha$  it holds that:  $r.\beta = t.\beta$ .

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$\alpha \rightarrow \beta$ : if two tuples have the same value for all attributes in  $\alpha$ , then they have the same values for all attributes in  $\beta$ .

“the  $\alpha$ -values uniquely (functionally) determine the  $\beta$ -values”



# Functional Dependencies

## Example

- a family tree implies the following FDs:
  - $\text{child} \rightarrow \text{father, mother}$

family tree				
child	mother	father	grandmother	grandfather
Sofie	Sabine	Alfons	Linde	Lothar
Sofie	Sabine	Alfons	Lisa	Hubert
Niklas	Sabine	Alfons	Linde	Lothar
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Sofie	...	...	Linde	Willi

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## Example

- schema  $\mathcal{R} = \{A, B, C, D\}$  of the relation  $R$
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$\{A\} \rightarrow \{B\}$   
 $\{C, D\} \rightarrow \{B\}$   
 $\{B\} \rightarrow \{C\}$   
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$R$			
$A$	$B$	$C$	$D$
a4	b2	c4	d3
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```

- for all possible values  $c$  the result of the query

$$\pi_{\beta}(\sigma_{\alpha=c}(R))$$

contains at most one tuple

# Satisfying a FD

algorithm to check whether a given  
relation  $R$  satisfies the FD  $\alpha \rightarrow \beta$ :

**input:**  $(R, \alpha \rightarrow \beta)$ : relation  $R$  and a FD  $\alpha \rightarrow \beta$

**output:** yes if FD is satisfied, no otherwise

**satisfiability**  $(R, \alpha \rightarrow \beta)$

- sort  $R$  by the values of  $\alpha$
- in case all groups of tuples with same values of  $\alpha$  have the same values for  $\beta$ : output(yes), output(no) otherwise



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running time of satisfiability is determined by the expense of the sorting -  $O(n \log n)$

# Overview

- motivation
- definition
- **determination**
- closure
- equivalence
- canonical cover
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# Determination of FDs

## Example

**given:** information about professors based on the following attributes  
professor: {[persNr, name, rank, room, city, street, zipcode, area code, state, population, state government]}

**question:** Which functional dependencies can be determined based on the semantics of the world to be modelled?

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- persNr is a candidate key:

$\{\text{persNr}\} \rightarrow \{\text{persNr, name, rank, room, city, street, zipcode, area code, state, population, state government}\}$

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- persNr is a candidate key:  
 $\{\text{persNr}\} \rightarrow \{\text{persNr, name, rank, room, city, street, zipcode, area code, state, population, state government}\}$
- cities are unique within a state:  
 $\{\text{city, state}\} \rightarrow \{\text{population, area code}\}$

# Determination of FDs

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- the zipcode identifies city, state and population:  
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# Determination of FDs

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- state government stores the governor's party:  
 $\{\text{state}\} \rightarrow \{\text{state government}\}$
- there can only be one professor assigned to a room:  
 $\{\text{room}\} \rightarrow \{\text{persNr}\}$

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# Closure of a Set of Attributes resp. FDs

given: set of FDs  $F$

example:  $\text{room} \rightarrow \text{persNr}$ ,  $\text{persNr} \rightarrow \text{name}$

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# Closure of a Set of Attributes

**given:** a set of attributes  $\gamma$  and a set of FDs  $F$

**question:** which attributes of  $\gamma$  are functionally determined by  $F$ ?

**example:**  $\{\text{room} \rightarrow \text{persNr}, \text{persNr} \rightarrow \text{name}\}, \{\text{room}\}$   
 $\Rightarrow \{\text{room}, \text{persNr}, \text{name}\}$

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## Definition (closure of a set of attributes)

The set of attributes  $\gamma^+$  which functionally depend on  $\gamma$  are called the closure of the set of attributes  $\gamma$ .

# Closure of a Set of Attributes

computation via algorithm **attrclosure**:

**input:**  $(F, \gamma)$ : set of FDs  $F$  and a set of attributes  $\gamma$

**output:** set of attributes  $\gamma^+$ .

```
attrclosure  $(F, \gamma)$   
   $\gamma^+ = \gamma$   
  while  $\exists(\alpha \rightarrow \beta) \in F$  with  $\alpha \subseteq \gamma^+$  and  $\beta \notin \gamma^+$  do  
     $\gamma^+ := \gamma^+ \cup \beta$   
  return $(\gamma^+)$ 
```



# Closure of a Set of Attributes

## Example

let  $F = \{RS \rightarrow T, U \rightarrow VX, RX \rightarrow W, T \rightarrow RU\}$

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## Definition ( $F_1 \models F_2$ )

The set  $F_2$  of FDs can be derived from the set  $F_1$  of FDs, if **every** relation  $R$  which satisfies all FDs in  $F_1$  also satisfies all FDs in  $F_2$ .

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The set of all FDs derivable from  $F$  is called the **closure**  $F^+$  of  $F$ .

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compare to mathematics:  $V$  a set of vectors. The set of all vectors that can be derived from  $V$  with linear combinations is called the linear closure of  $V$ .

# Deriving FDs through the Attribute Closure

FD  $\alpha \rightarrow \beta$ : the values for  $\alpha$  functionally determine the values for  $\beta$ .

**attribute closure:** all attributes  $\gamma^+$ , whose values of  $\gamma$  are functionally determined by  $F$

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## Theorem

*Given a set of FDs  $F$  and a set of attributes  $\gamma$  it holds that:*

$$F \models \{\gamma \rightarrow \text{attrclosure}(F, \gamma)\}$$

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*Given a set of FDs  $F$  and a set of attributes  $\gamma$  it holds that:*

$$F \models \{\gamma \rightarrow \text{attrclosure}(F, \gamma)\}$$

Moreover:  $F \models \{\alpha \rightarrow \beta\} \Leftrightarrow \beta \subseteq \text{attrclosure}(F, \alpha)$

# Deriving FDs via Armstrong Axioms

Construction of the closure  $F^+$  of  $F$  via **Armstrong axioms (1974)**.

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## Theorem

*The Armstrong axioms are **complete** (construct all implicit FDs) and **sound** (construct only valid FDs).*



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**pseudo transitivity:**  $\alpha \rightarrow \beta$  and  $\gamma\beta \rightarrow \delta \Rightarrow \alpha\gamma \rightarrow \delta$ .

# The Armstrong Axioms

## Example

deriving FD  $\{\text{zipcode}\} \rightarrow \{\text{state government}\}$  from the remaining FDs in the example schema professors:

we know:  $\{\text{zipcode}\} \rightarrow \{\text{state, city, population}\}$  and  
 $\{\text{state}\} \rightarrow \{\text{state government}\}$



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transitivity of  $\{\text{zipcode}\} \rightarrow \{\text{state}\}, \{\text{state}\} \rightarrow \{\text{state government}\}$ :  
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## Example

deriving **union** from reflexivity, augmentation and transitivity:

given:  $\alpha \rightarrow \beta, \alpha \rightarrow \gamma$

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deriving **union** from reflexivity, augmentation and transitivity:

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step 2: **augmentation** of  $\alpha \rightarrow \gamma$ :  $\alpha\beta \rightarrow \beta\gamma$

step 3: **transitivity** of  $\alpha \rightarrow \alpha\beta, \alpha\beta \rightarrow \beta\gamma$ :  $\alpha \rightarrow \beta\gamma$

# Overview

- motivation
- definition
- determination
- closure
- equivalence
- canonical cover
- key

# Equivalence of Sets of FDs

given: sets  $F_1$ ,  $F_2$  of FDs

question: Do  $F_1$  and  $F_2$  describe the same set of FDs?



# Equivalence of Sets of FDs

## Definition (equivalence of FDs)

Two sets  $F, G$  of FDs are equivalent ( $F \equiv G$ ), if their closures are equivalent, i.e.  $F^+ = G^+$ .

mathematics: two sets of vectors are “equivalent”, if they span the same vector space.

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mathematics: two sets of vectors are “equivalent”, if they span the same vector space.

obviously:  $F \equiv G$  if and only if

- $F \subseteq G^+$  and
- $G \subseteq F^+$

# Equivalence of Sets of FDs

## Example (Armstrong axioms)

$$F_1 = \{A \rightarrow B, B \rightarrow C, C \rightarrow A\}$$

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# Equivalence of Sets of FDs

## Example (attribute closure)

$$F_1 = \{A \rightarrow B, B \rightarrow C, C \rightarrow A\}$$

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$$A \rightarrow B: \checkmark$$

$$B \in$$

$$\text{attrclosure}(F_2, \{A\})$$

$$B \rightarrow C: \checkmark$$

$$C \rightarrow A: \checkmark$$

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to show:  $F_1 \equiv F_2$  resp.  $F_1 \not\equiv F_2$

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$F_1 \equiv F_2$ : show that  $F_1 \subseteq F_2^+$  and  $F_2 \subseteq F_1^+$

# Equivalence of Sets of FDs

given: sets of FDs  $F_1, F_2$

to show:  $F_1 \equiv F_2$  resp.  $F_1 \not\equiv F_2$ ?

$F_1 \equiv F_2$ : show that  $F_1 \subseteq F_2^+$  and  $F_2 \subseteq F_1^+$

$F_1 \not\equiv F_2$ : find FD  $\alpha \rightarrow \beta \in F_1^+$  such that  $\alpha \rightarrow \beta \notin F_2^+$   
(or vice versa)

# Equivalence of Sets of FDs

given: sets of FDs  $F_1, F_2$

to show:  $F_1 \equiv F_2$  resp.  $F_1 \not\equiv F_2$ ?

$F_1 \equiv F_2$ : show that  $F_1 \subseteq F_2^+$  and  $F_2 \subseteq F_1^+$

$F_1 \not\equiv F_2$ : find FD  $\alpha \rightarrow \beta \in F_1^+$  such that  $\alpha \rightarrow \beta \notin F_2^+$   
(or vice versa)

show that  $\alpha \rightarrow \beta \notin F_2^+$  if and only if  $\beta \notin \text{attrclosure}(F_2, \alpha)$



# Overview

- motivation
- definition
- determination
- closure
- equivalence
- canonical cover
- key

# Canonical Cover

**problem:** find the shortest possible representation of FDs (“basis”)

# Canonical Cover

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**solution:** the canonical cover

mathematics: basis of a vector space

# Canonical Cover

## Definition (canonical cover)

$F_C$  is called **canonical cover** of a set of FDs  $F$  if the following criteria are satisfied:

- 1  $F_C^+ = F^+$  ( $F_C$  is equivalent to  $F$ )
- 2 in  $F_C$  there are **no** FDs that contain **superfluous attributes**
- 3 each **left side** of a FD in  $F_C$  is **unique**

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## Theorem

*To each set  $F$  of FDs there is a **canonical cover**  $F_C$ .*

mathematics: to each set of vectors that span a vector space there is a base.

# Computation of the Canonical Cover (1)

the construction of a canonical cover is obtained directly from the definition:

- 1 split all FDs using **decomposition** on the right side (equivalence is guaranteed)

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To ensure obtaining only equivalent results during the reduction steps we will use the algorithm **attrclosure**.

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**... the left reduction:**

$$B \in \text{attrclosure}(F, \alpha - A) \Leftrightarrow F \equiv (F \setminus \{\alpha \rightarrow B\}) \cup \{(\alpha - A) \rightarrow B\}$$

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# Computation of the Canonical Cover (Example)

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$A \rightarrow C$ :  $C \in \text{attrclosure}(F \setminus \{A \rightarrow C\}, A)$  **yes**  
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3 union not applicable  $\Rightarrow F_C := \{A \rightarrow B, B \rightarrow C\}$

# Canonical Cover

## Example

$$F = \{A \rightarrow BD, AC \rightarrow E, CD \rightarrow E, E \rightarrow A, D \rightarrow C\}$$

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2 left reduction:

$A \rightarrow B$ : ok

$A \rightarrow D$ : ok

$E \rightarrow A$ : ok

$D \rightarrow C$ : ok



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$$CD \rightarrow E: E \in \text{attrclosure}(F, C) \text{ no}$$

$$E \in \text{attrclosure}(F, D) \text{ yes} \Rightarrow$$

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$$F = \{A \rightarrow B, A \rightarrow D, A \rightarrow E, D \rightarrow E, E \rightarrow A, D \rightarrow C\}$$

3 right reduction:

$A \rightarrow B$ :  $B \in \text{attrclosure}(F \setminus \{A \rightarrow B\}, A)$  **no**

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4 combination:  $F_C = \{A \rightarrow BD, D \rightarrow EC, E \rightarrow A\}$

# Overview

- motivation
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# Key

## Definition (key)

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$\Rightarrow$  every key is also a super key

# Classification of Keys

## Example

A city is described by its name, the corresponding state, the area code and the population.

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# Classification of Keys via attrclosure

**problem:** find key candidates of a relation  $R$  based on the given FDs

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- 1  $\gamma \rightarrow \mathcal{R}$
- 2  $\gamma$  is minimal, i.e..  $\forall A \in \gamma : (\gamma - \{A\}) \not\rightarrow \mathcal{R}$

- 1  $\gamma \rightarrow \mathcal{R}$ , when  $\text{attrclosure}(F, \gamma) = \mathcal{R}$

# Classification of Keys via attrclosure

**problem:** find key candidates of a relation  $R$  based on the given FDs

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- 1  $\gamma \rightarrow \mathcal{R}$ , when  $\text{attrclosure}(F, \gamma) = \mathcal{R}$
  - 2 minimality is satisfied, if for every attribute  $A$  in  $\gamma$ :  
 $\text{attrclosure}(F, \gamma - \{A\}) \neq \mathcal{R}$



# Classification of Keys via attrclosure

## Example

$$\mathcal{R} = \{ABCDEF\}, F_d = \{C \rightarrow BDAE\}$$

- time consuming procedure: trying out all the one-element, two-element, three-element key candidates using attrclosure

# Classification of Keys via attrclosure

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$CF$  is the key of  $\mathcal{R}$

# Classification of Keys via attrclosure

## Example

$\mathcal{R} = \{ABCDEF\}, F_d = \{C \rightarrow BD, D \rightarrow AE, E \rightarrow CF, F \rightarrow E\}$   
heuristics cannot be used here, as all attributes are derivable

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heuristics cannot be used here, as all attributes are derivable

**C**:  $\text{attrclosure}(F_d, C) = \{C, B, D, A, E, F\} \Rightarrow C$  is key of  $\mathcal{R}$

# Classification of Keys via attrclosure

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$\mathcal{R} = \{ABCDEF\}, F_d = \{C \rightarrow BD, D \rightarrow AE, E \rightarrow CF, F \rightarrow E\}$

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**attention:**  $C$  derivable from  $E$ , therefore:

**E:**  $\text{attrclosure}(F_d, E) = \{E, C, B, D, A, F\} \Rightarrow E$  is also key of  $\mathcal{R}$



# Classification of Keys via attrclosure

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**F:**  $\text{attrclosure}(F_d, F) = \{F, E, C, B, D, A\} \Rightarrow F$  is key of  $\mathcal{R}$

$\Rightarrow$

$C, D, E, F$  are the keys of  $\mathcal{R}$

# Algorithm for the Calculation of all Keys

**input:**  $(F, \mathcal{R})$ : set  $F$  of FDs and schema  $\mathcal{R}$

**output:** set of all keys of  $\mathcal{R}$

**allkeys**  $(F, \mathcal{R})$

$keys = \{minimize(F, \mathcal{R}, \mathcal{R})\}$  // find 1. key

**for each**  $key \in keys$ :

**for each**  $att \in key$ :

**for each**  $\alpha \rightarrow \beta \in F$ :

**if**  $att \in \beta$ :

$nkey = (key \setminus \{att\}) \cup \alpha$

**if**  $\nexists k \in keys$  with  $k \subseteq nkey$ :

$keys = keys \cup \{minimize(F, nkey, \mathcal{R})\}$

**return** keys

**minimize** $(F, \gamma, \delta)$ : returns a minimal subset  $\gamma' \subseteq \gamma$  such that  
 $\delta \subseteq attrclosure(F, \gamma')$ .

# Computation of all Keys of a Schema

## Example

$\mathcal{R} = \{ABCDEFG\}$ ,  $F_d = \{B \rightarrow BEF, DE \rightarrow AC, A \rightarrow BDG\}$

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- 1 find 1. key:  $\text{attrclosure}(F_d, \{A\}) = \mathcal{R} \Rightarrow \text{keys} = \{A\}$
- 2 construct new key from *keys*:
  - $\text{key} = A, \text{att} = A$ :
    - $B \rightarrow BEF, A \rightarrow BDG: A \notin \beta$
    - $DE \rightarrow AC$ :

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*minimize* :  $\text{attrclosure}(F_d, \{D\}) \neq \mathcal{R}$  and  $\text{attrclosure}(F_d, \{E\}) \neq \mathcal{R}$

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- *key* = *DE*, *att* = *D*:

- $B \rightarrow BEF, DE \rightarrow AC: D \notin \beta$

- $A \rightarrow BDG:$

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- *key* = *DE*, *att* = *D*:

- $B \rightarrow BEF, DE \rightarrow AC: D \notin \beta$

- $A \rightarrow BDG: nkey = AE;$

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 $\Rightarrow \text{keys} = \{A, DE\}$

- *key* = *DE*, *att* = *D*:

- $B \rightarrow BEF, DE \rightarrow AC: D \notin \beta$

- $A \rightarrow BDG: nkey = AE; A \subseteq AE$

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 $\Rightarrow \text{keys} = \{A, DE\}$
  - key = DE, att = D:
    - $B \rightarrow BEF, DE \rightarrow AC: D \notin \beta$
    - $A \rightarrow BDG: nkey = AE; A \subseteq AE \Rightarrow \text{keys} = \{A, DE\}$
  - key = DE, att = E:
    - $A \rightarrow BDG, DE \rightarrow AC: E \notin \beta$
    - $B \rightarrow BEF:$

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  - key = DE, att = D:
    - $B \rightarrow BEF, DE \rightarrow AC: D \notin \beta$
    - $A \rightarrow BDG: nkey = AE; A \subseteq AE \Rightarrow \text{keys} = \{A, DE\}$
  - key = DE, att = E:
    - $A \rightarrow BDG, DE \rightarrow AC: E \notin \beta$
    - $B \rightarrow BEF: nkey = BD;$

# Computation of all Keys of a Schema

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 minimize :  $\text{attrclosure}(F_d, \{D\}) \neq \mathcal{R}$  and  $\text{attrclosure}(F_d, \{E\}) \neq \mathcal{R}$   
 $\Rightarrow \text{keys} = \{A, DE\}$
  - key = DE, att = D:
    - $B \rightarrow BEF, DE \rightarrow AC: D \notin \beta$
    - $A \rightarrow BDG: nkey = AE; A \subseteq AE \Rightarrow \text{keys} = \{A, DE\}$
  - key = DE, att = E:
    - $A \rightarrow BDG, DE \rightarrow AC: E \notin \beta$
    - $B \rightarrow BEF: nkey = BD;$   
 minimize :  $\text{attrclosure}(F_d, \{B\}) \neq \mathcal{R}$  and  $\text{attrclosure}(F_d, \{D\}) \neq \mathcal{R}$



# Computation of all Keys of a Schema

## Example

$\mathcal{R} = \{ABCDEFGG\}$ ,  $F_d = \{B \rightarrow BEF, DE \rightarrow AC, A \rightarrow BDG\}$

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  - key = DE, att = D:
    - $B \rightarrow BEF, DE \rightarrow AC: D \notin \beta$
    - $A \rightarrow BDG: nkey = AE; A \subseteq AE \Rightarrow \text{keys} = \{A, DE\}$
  - key = DE, att = E:
    - $A \rightarrow BDG, DE \rightarrow AC: E \notin \beta$
    - $B \rightarrow BEF: nkey = BD;$   
 minimize :  $\text{attrclosure}(F_d, \{B\}) \neq \mathcal{R}$  and  $\text{attrclosure}(F_d, \{D\}) \neq \mathcal{R}$   
 $\Rightarrow \text{keys} = \{A, DE, BD\}$

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 minimize :  $\text{attrclosure}(F_d, \{D\}) \neq \mathcal{R}$  and  $\text{attrclosure}(F_d, \{E\}) \neq \mathcal{R}$   
 $\Rightarrow \text{keys} = \{A, DE\}$
  - key = DE, att = D:
    - $B \rightarrow BEF, DE \rightarrow AC: D \notin \beta$
    - $A \rightarrow BDG: nkey = AE; A \subseteq AE \Rightarrow \text{keys} = \{A, DE\}$
  - key = DE, att = E:
    - $A \rightarrow BDG, DE \rightarrow AC: E \notin \beta$
    - $B \rightarrow BEF: nkey = BD;$   
 minimize :  $\text{attrclosure}(F_d, \{B\}) \neq \mathcal{R}$  and  $\text{attrclosure}(F_d, \{D\}) \neq \mathcal{R}$   
 $\Rightarrow \text{keys} = \{A, DE, BD\}$

# Computation of all Keys of a Schema

## Example (continuation)

$\mathcal{R} = \{ABCDEFG\}$ ,  $F_d = \{B \rightarrow BEF, DE \rightarrow AC, A \rightarrow BDG\}$

2 construct new key from keys:

- $key = BD$ ,  $att = B$ :
  - $DE \rightarrow AC$ :  $B \notin \beta$
  - $A \rightarrow BDG$ :

# Computation of all Keys of a Schema

## Example (continuation)

$\mathcal{R} = \{ABCDEFG\}$ ,  $F_d = \{B \rightarrow BEF, DE \rightarrow AC, A \rightarrow BDG\}$

2 construct new key from keys:

- $key = BD$ ,  $att = B$ :

- $DE \rightarrow AC$ :  $B \notin \beta$

- $A \rightarrow BDG$ :  $nkey = AD$ ;  $A \subseteq AD \Rightarrow keys = \{A, DE, BD\}$

# Computation of all Keys of a Schema

## Example (continuation)

$\mathcal{R} = \{ABCDEFG\}$ ,  $F_d = \{B \rightarrow BEF, DE \rightarrow AC, A \rightarrow BDG\}$

2 construct new key from keys:

- $key = BD$ ,  $att = B$ :

- $DE \rightarrow AC$ :  $B \notin \beta$

- $A \rightarrow BDG$ :  $nkey = AD$ ;  $A \subseteq AD \Rightarrow keys = \{A, DE, BD\}$

- $B \rightarrow BEF$ :

# Computation of all Keys of a Schema

## Example (continuation)

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2 construct new key from keys:

- $key = BD$ ,  $att = B$ :

- $DE \rightarrow AC$ :  $B \notin \beta$

- $A \rightarrow BDG$ :  $nkey = AD$ ;  $A \subseteq AD \Rightarrow keys = \{A, DE, BD\}$

- $B \rightarrow BEF$ :  $nkey = BD$ ;  $BD \subseteq BD \Rightarrow keys = \{A, DE, BD\}$

# Computation of all Keys of a Schema

## Example (continuation)

$\mathcal{R} = \{ABCDEFG\}$ ,  $F_d = \{B \rightarrow BEF, DE \rightarrow AC, A \rightarrow BDG\}$

2 construct new key from keys:

- key =  $BD$ , att =  $B$ :
  - $DE \rightarrow AC$ :  $B \notin \beta$
  - $A \rightarrow BDG$ :  $nkey = AD$ ;  $A \subseteq AD \Rightarrow keys = \{A, DE, BD\}$
  - $B \rightarrow BEF$ :  $nkey = BD$ ;  $BD \subseteq BD \Rightarrow keys = \{A, DE, BD\}$
- key =  $BD$ , att =  $D$ :
  - $DE \rightarrow AC, B \rightarrow BEF$ :  $D \notin \beta$
  - $A \rightarrow BDG$ :

# Computation of all Keys of a Schema

## Example (continuation)

$\mathcal{R} = \{ABCDEFG\}$ ,  $F_d = \{B \rightarrow BEF, DE \rightarrow AC, A \rightarrow BDG\}$

2 construct new key from keys:

- key =  $BD$ , att =  $B$ :

- $DE \rightarrow AC$ :  $B \notin \beta$

- $A \rightarrow BDG$ :  $nkey = AD$ ;  $A \subseteq AD \Rightarrow keys = \{A, DE, BD\}$

- $B \rightarrow BEF$ :  $nkey = BD$ ;  $BD \subseteq BD \Rightarrow keys = \{A, DE, BD\}$

- key =  $BD$ , att =  $D$ :

- $DE \rightarrow AC, B \rightarrow BEF$ :  $D \notin \beta$

- $A \rightarrow BDG$ :  $nkey = AB$ ;  $A \subseteq AB \Rightarrow keys = \{A, DE, BD\}$

3 keys =  $\{A, DE, BD\}$



# Learning Objectives

- What are FDs?
  - When is a FD satisfied, how can we check this condition?
- What is the attribute closure and the closure of FDs?
  - How do we compute them?
- When are two sets of FDs equivalent?
- What are the Armstrong axioms?
  - What are they needed for, how do they look like?
- What is the canonical cover?
  - How can we compute it?
- What are (super) keys?
  - How can we recognize/check them?