

# CSCI-620

# **Normalization**

## Roadmap

1. Introduction to normalization
2. Keys and functional dependencies
3. Normal forms and decomposition
4. Functional dependency discovery
5. Denormalization



# Normalization

1	id	name	description	date	email	fn	ln	dob	st	city	zipcode	state
2	1	Ender's Game	The Sci-Fi book by Scott Card	2.01609E+11	u1@rit.edu	Sandra	Smith	19780905	156 Monroe Ave	Brighton	14512	NY
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# Starting point

## Reasons for Normalizing

- ▶ Designs *may* be more efficient
- ▶ Reduces the amount of redundant data stored (usually)
- ▶ Avoids *anomalies* when updating, inserting, or deleting data

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	??		?	?	u8@rit.edu	John	Doe	19920302	249 Brown Street	Rochester	14623	NY

# Insertion Anomalies

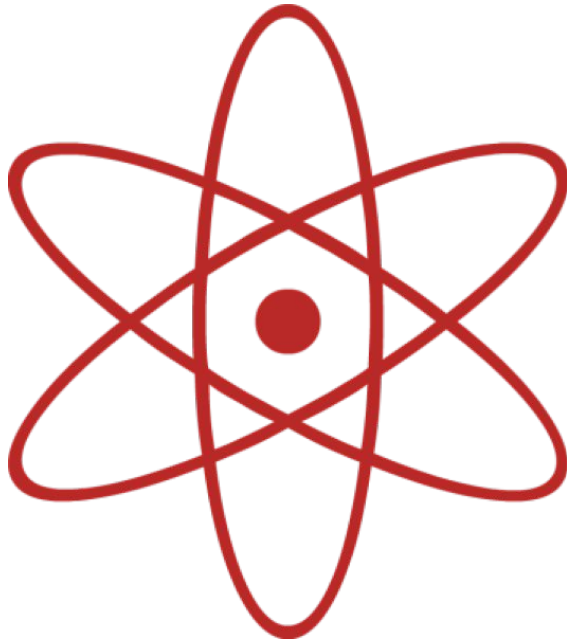


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# Deletion Anomalies

# Normalizing

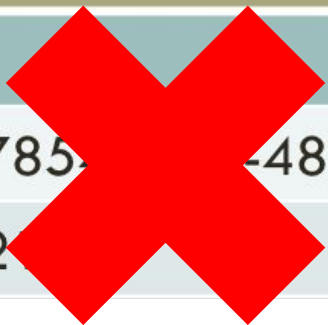
1. Analyze first normal form (1NF)
2. Identify keys and functional dependencies (FDs)
3. Decompose to third normal form (3NF)
4. Analyze results



Values must be atomic

**First normal form**

Doctor		
ssn	lastName	patients
479-23-8734	Moore	235-14-7855 -48-0924
293-58-9309	Kent	821-13-2



# No structure in attributes



One Lomb Memorial Drive,  
Rochester, NY 14623-5603

**Special case: addresses**

# CSCI-620

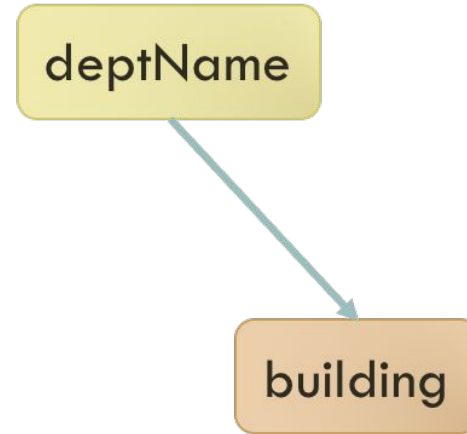
**Special case: course ID**

# Roadmap

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Keys



Functional  
dependencies

# Identify keys and FDs





Super



Candidate



Primary

# Types of keys

Patient		
ssn	firstName	lastName
235-14-7854	Sandra	Smith
192-48-0924	John	Moore
821-13-2108	Laura	Turner
874-72-0093	John	Moore

{firstName, lastName}

{firstName}



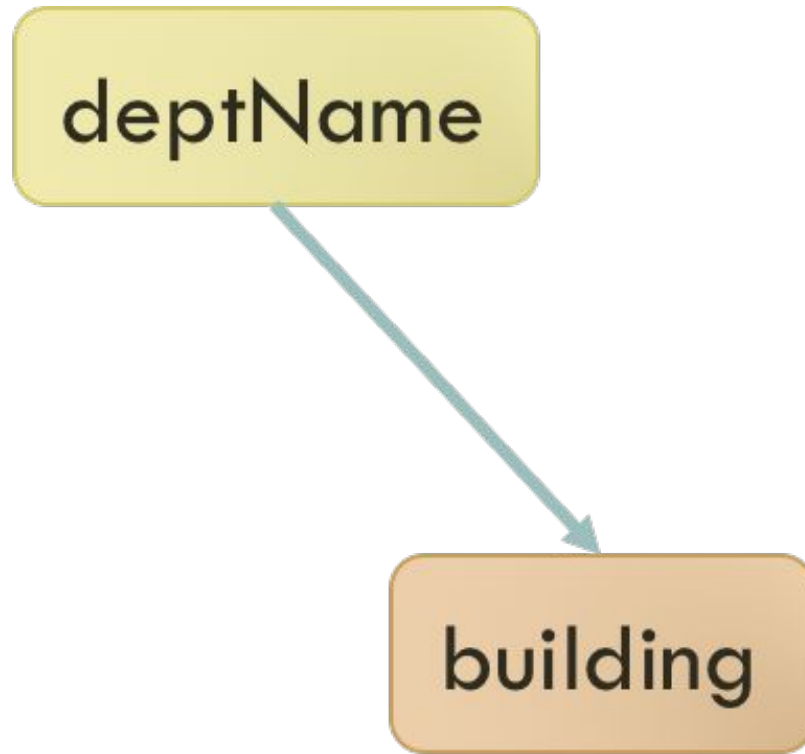
{ssn, lastName}



# Superkeys (informally)

Let  $r(R)$  be a relation name with  $R$  attributes.  $K \subseteq R$  is a superkey of  $r(R)$  if, for all tuples  $t_1$  and  $t_2$  in the instance of  $r$ , if  $t_1 \neq t_2$  then  $t_1[K] \neq t_2[K]$ . That is, no two tuples in any instance of relation  $r$  may have the same value on attribute set  $K$ . Clearly, if no two tuples in  $r$  have the same value on  $K$ , then a  $K$ -value uniquely identifies a tuple in  $r$ .

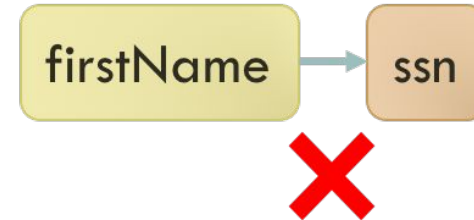
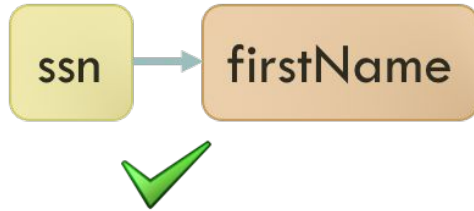
## Superkeys (formally)



# Functional dependencies



Patient		
ssn	firstName	lastName
235-14-7854	Sandra	Smith
192-48-0924	John	Moore
821-13-2108	Laura	Turner
874-72-0093	John	Moore



# FDs (informally)

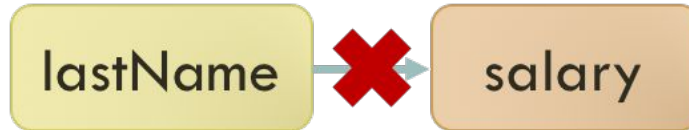
Let  $r(R)$  be a relation name with  $R$  attributes, and  $\alpha \subseteq R$  and  $\beta \subseteq R$ . An instance of  $r$  satisfies the functional dependency  $\alpha \rightarrow \beta$  if, for all tuples  $t_1$  and  $t_2$  in the instance such that  $t_1[\alpha] = t_2[\alpha]$ , it is also the case that  $t_1[\beta] = t_2[\beta]$ . We say that a functional dependency  $\alpha \rightarrow \beta$  holds on  $r(R)$  if every instance of  $r(R)$  satisfies the functional dependency.

## **FDs (formally)**

Instructor		
id	lastName	salary
44	Smith	\$65K
47	Moore	\$67K



id	lastName	salary
49	Smith	\$69K



# Defining FDs

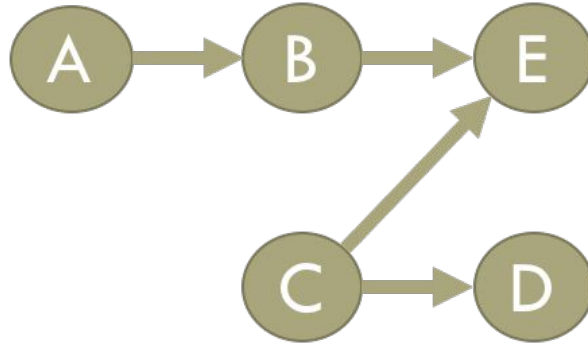


$\alpha$  (a set of attributes) is a superkey for relation  $r(R)$  if  $R \subseteq \alpha^+$ .

# Identifying superkeys



Starting with a set of attributes, can I reach all possible attributes?



# Identifying superkeys

result  $:= \alpha$

Do

For each  $\gamma \rightarrow \delta$  in  $F$

If  $(\gamma \subseteq \text{result})$

    result  $:= \text{result} \cup \delta$

While (result change);

Return result

# Closure of $\alpha$ under $F$ ( $\alpha^+$ )



Having  $F$ , a simplified set of functional dependencies that works exactly the same as  $F$ .

# Canonical cover



Attributes that we can remove without altering the functional dependencies.

# Extraneous attributes

Given  $\alpha \rightarrow \beta$ :

- $A \in \alpha$  is extraneous if  $\beta \subseteq (\alpha - A)^+$  under  $F$   
A is not necessary to infer  $\beta$

or

- $A \in \beta$  is extraneous if  $A \in \alpha^+$  under  
 $F' = (F - \{\alpha \rightarrow \beta\}) \cup \{\alpha \rightarrow (\beta - A)\}$   
A can be inferred from other FDs in  $F$  using  $\alpha$

# Extraneous attributes

result := F

Do {

    If  $\alpha \rightarrow \beta$  in result has a extraneous attribute,

        remove the attribute from  $\alpha \rightarrow \beta$  in result

} While (result change)

Return result

# Canonical cover

**$F = \{A \rightarrow BC, B \rightarrow C, A \rightarrow B, AB \rightarrow C, A \rightarrow C\}$**

$A \rightarrow BC$  can have  $B$  removed because of  $A \rightarrow B$  (now  $A \rightarrow C$ )

$AB \rightarrow C$  can be removed because of  $B \rightarrow C$  and  $A \rightarrow C$

$A \rightarrow C$  can be removed because of  $A \rightarrow B$  and  $B \rightarrow C$

**$F^+ = \{A \rightarrow B, B \rightarrow C\}$**

**Canonical cover**



## **Core**

1. All attributes that never appear in functional dependencies
2. All attributes that are only on the left-hand side of functional dependencies and never on the right

## **Exterior**

3. All attributes that appear on the right-hand side of some functional dependency

# Finding candidate keys

**ABCD**

$ABC \rightarrow D$

$D \rightarrow A$

**Core**

**Exterior**

BC

DA

**ABCDEFG**

$AB \rightarrow F$

$AD \rightarrow E$

$F \rightarrow G$

**Core**

**Exterior**

ABCD

EFG

# Finding candidate keys

Test the closure of the core. If this is the complete set of attributes, the core is the only candidate key.

Otherwise, try combining the core with one attribute in the exterior and check the closure. If the closure is the complete set of attributes, this is another candidate key.

Otherwise, continue adding attributes and checking the closure until you find all candidate keys. Do *not* consider any attributes which are a superset of an existing candidate key.

# Finding candidate keys

**ABCD**

$ABC \rightarrow D$	<b>Core</b>	BC
$D \rightarrow A$	<b>Exterior</b>	AD

**Closure of the core** BC

<b>Combination</b>	<b>Closure</b>	
ABC	ABCD	✓
BCD	ABCD	✓

# Finding candidate keys

## Roadmap

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Patient	
PK	ssn
	firstName
	lastName
	city
	state
	zipCode

$$\text{ssn} \rightarrow \{\text{firstName}, \text{lastName}, \text{zipCode}, \text{city}\}$$

$$\{\text{zipCode}, \text{city}\} \rightarrow \text{state}$$

# Transitive dependencies

For each  $\alpha \rightarrow \beta$ :

- Trivial ( $\beta \subseteq \alpha$ )

OR

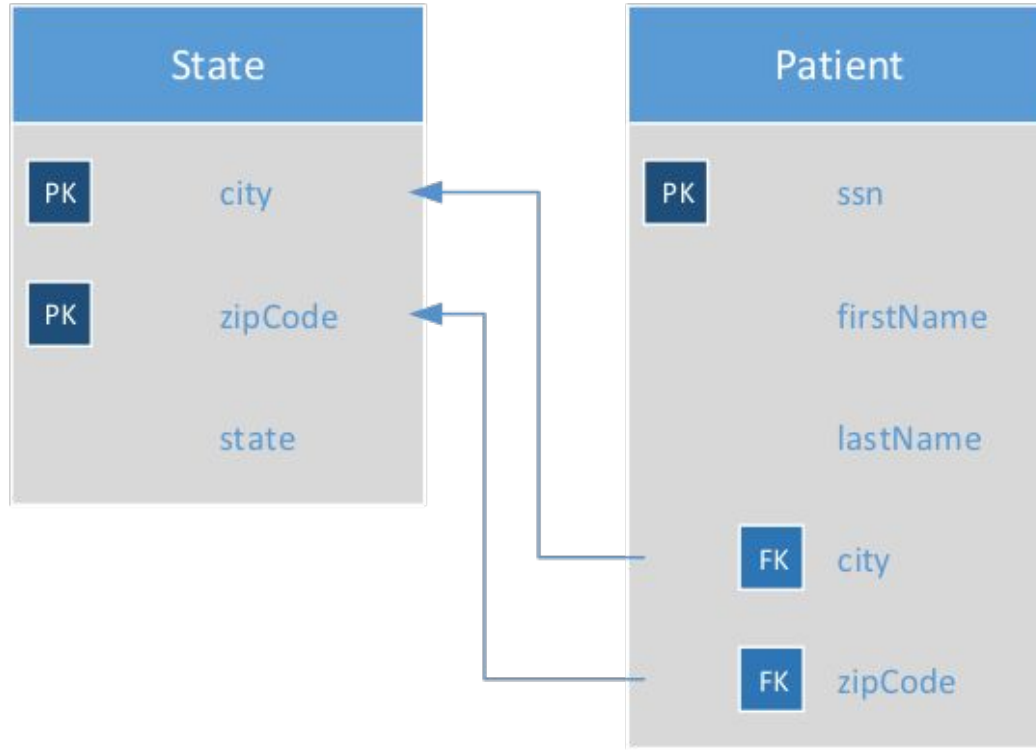
- $\alpha$  is superkey

OR

- $\beta - \alpha$  is contained in some candidate key

# Testing 3NF





# 3NF Decomposition

Let  $r$  be a relation and  $F$  a set of FDs,  $F_C$  is a canonical cover for  $F$

For each  $\alpha \rightarrow \beta$  in  $F_C$

    Create  $r_i(\alpha\beta)$

If none  $r_i$  contains a candidate key for  $r$

    Create  $r_i(\text{Any candidate key})$

Remove all redundant  $r_x(\alpha) \subseteq r_y(\beta)$

Return all relations

# 3NF Decomposition



## Tournament Winners

<u>Tournament</u>	<u>Year</u>	Winner	Winner Date of Birth
Indiana Invitational	1998	Al Fredrickson	21 July 1975
Cleveland Open	1999	Bob Albertson	28 September 1968
Des Moines Masters	1999	Al Fredrickson	21 July 1975
Indiana Invitational	1999	Chip Masterson	14 March 1977

Tournament, Year → Winner, Winner Date of Birth  
Winner → Winner Date of Birth

# 3NF Example

**Canonical**      Tournament, Year  $\rightarrow$  Winner  
**cover**          ~~Winner  $\rightarrow$  Winner Date of Birth~~

The second FD is

**Not trivial**

**The left-hand side is not a superkey**

**The right-hand side minus the left is not  
part of a candidate key**

# 3NF Example

### Tournament Winners

<u>Tournament</u>	<u>Year</u>	Winner
Indiana Invitational	1998	Al Fredrickson
Cleveland Open	1999	Bob Albertson
Des Moines Masters	1999	Al Fredrickson
Indiana Invitational	1999	Chip Masterson

### Winner Dates of Birth

<u>Winner</u>	Date of Birth
Chip Masterson	14 March 1977
Al Fredrickson	21 July 1975
Bob Albertson	28 September 1968

# 3NF Example



**TABLE\_BOOK\_DETAIL**

Book ID	Genre ID	Genre Type	Price
1	1	Gardening	25.99
2	2	Sports	14.99
3	1	Gardening	10.00
4	3	Travel	12.99
5	2	Sports	17.99

Book ID → Genre ID, Genre Type, Price  
Genre ID → Genre Type

## 3NF Example

**Canonical**      Book ID  $\rightarrow$  Genre ID, Genre Type  
**cover**      ~~Genre ID  $\rightarrow$  Genre Type~~

The second FD is

**Not trivial**

**The left-hand side is not a superkey**

**The right-hand side minus the left is not  
part of a candidate key**

# 3NF Example

**TABLE\_BOOK**

Book ID	Genre ID	Price
1	1	25.99
2	2	14.99
3	1	10.00
4	3	12.99
5	2	17.99

**TABLE\_GENRE**

Genre ID	Genre Type
1	Gardening
2	Sports
3	Travel

## 3NF Example



ID	name	street	city	salary
⋮	Kim	Main	Perryridge	75000
57766	Kim	North	Hampton	67000
98776	Kim			
⋮				

*employee*

ID	name
⋮	Kim
57766	Kim
98776	Kim
⋮	

name	street	city	salary
⋮			
Kim	Main	Perryridge	75000
Kim	North	Hampton	67000
⋮			

*natural join*

ID	name	street	city	salary
⋮				
57766	Kim	Main	Perryridge	75000
57766	Kim	North	Hampton	67000
98776	Kim	Main	Perryridge	75000
98776	Kim	North	Hampton	67000
⋮				

# Lossy join

Decomposition of  $R = (A, B, C)$

$$R_1 = (A, B) \quad R_2 = (B, C)$$

A	B	C
$\alpha$	1	A
$\beta$	2	B

$r$

A	B
$\alpha$	1
$\beta$	2

$\Pi_{A,B}(r)$

B	C
1	A
2	B

$\Pi_{B,C}(r)$

$\Pi_A(r) \bowtie \Pi_B(r)$

A	B	C
$\alpha$	1	A
$\beta$	2	B

# Lossless join

## ER model and normalizing

- ▶ A carefully designed ER model means we don't normally need normalization
- ▶ However, functional dependencies may indicate the design is not normalized
- ▶ Checking that our model is normalized can confirm the quality of ER model

## Roadmap

1. Introduction to normalization
2. Keys and functional dependencies
3. Normal forms and decomposition
4. **Functional dependency discovery**
5. Denormalization

- All possible attribute combinations; for instance,  $r(a, b, c)$ :

- $\{a\} \rightarrow a$

- $\{a\} \rightarrow b$

- $\{a\} \rightarrow c$

- $\{b\} \rightarrow a$

- ...

- $\{a, b\} \rightarrow c$

- ...

- $\{a, b, c\} \rightarrow c$

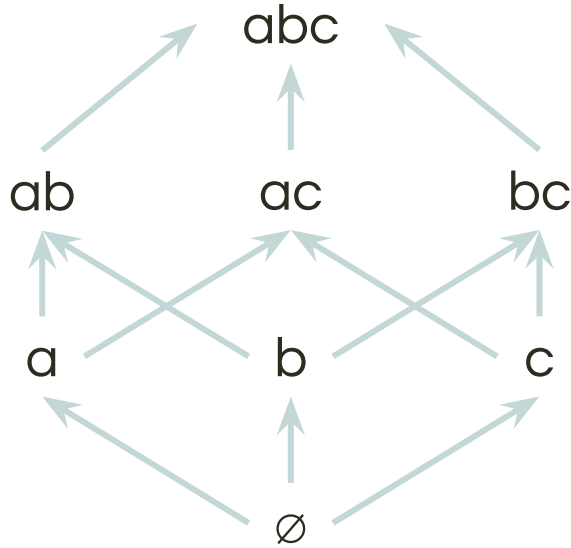
$$\mathcal{O}\left(n^2 \left(\frac{m}{2}\right)^2 2^m\right)$$

# Naive approach

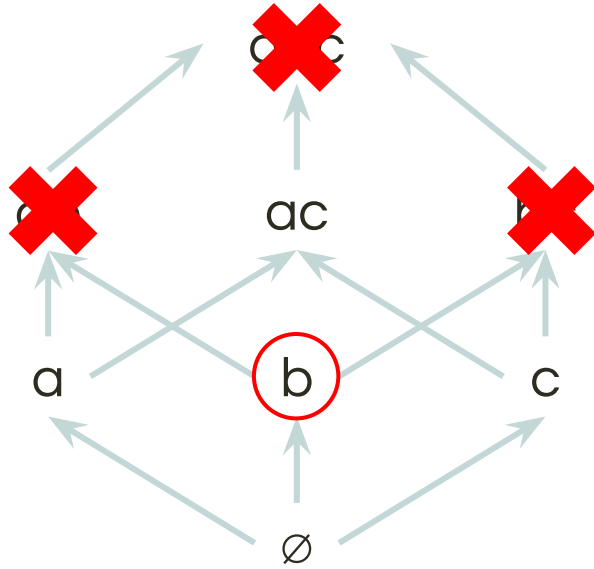
## Two problems

1. We check all dependencies even if we should already know some of them are true (e.g.  $A \rightarrow B$  implies  $AC \rightarrow B$ )
2. Checking a single dependency is  $O(n^2)$

$r(a, b, c)$  has the following lattice:



# Lattice traversal



For a given left-hand side (LHS), any dependency at lower levels of the lattice implies all dependencies which are higher are true.

# Lattice traversal



- $\Pi_{\alpha}$  is a partition of the tuples of a relation  $r$
- Tuples  $t1$  and  $t2$  belong to  $\Pi_{\alpha}$  iff  $\forall x \in \alpha: t1[x] = t2[x]$

Instructor		
	first	last
t1	Peter	Miller
t2	Thomas	Miller
t3	Peter	Moore
t4	Peter	Miller

- $\Pi_{\{\text{first}\}} = \{\{t1, t3, t4\}, \{t2\}\}$
- $\Pi_{\{\text{last}\}} = \{\{t1, t2, t4\}, \{t3\}\}$
- $\Pi_{\{\text{first}, \text{last}\}} = \Pi_{\{\text{first}\}} \cap \Pi_{\{\text{last}\}} = \{\{t1, t4\}, \{t2\}, \{t3\}\}$

# Partitions

- A partition  $\Pi$  refines another partition  $\Pi'$  if every equivalence class in  $\Pi$  is subset of some equivalence class in  $\Pi'$
- For instance,  $\Pi = \{\{t1, t2\}, \{t3\}\}$  refines  $\Pi' = \{\{t1, t2, t3\}\}$  but  $\Pi'$  does not refine  $\Pi$
- A functional dependency  $\alpha \rightarrow a$  holds iff  $\Pi_\alpha$  refines  $\Pi_{\{a\}}$  (Proof omitted)

# Refinement

- Generate partitions for individual attributes ( $\Pi_{\{a\}}$ ,  $\Pi_{\{b\}}$ , etc.)
- $FDS := \emptyset$
- For each level in the lattice starting from level zero (bottom-up) and each set of attributes  $\alpha$  in each level:

# Algorithm

*(Inside loop)*

- For each possible right-hand side (RHS) attribute  $b$ :
  - If FDS contains any functional dependency such that  $\beta \rightarrow b$  where  $\beta \subset \alpha$ , then skip
  - Compute  $\Pi_\alpha$  and if  $\Pi_\alpha$  refines  $\Pi_{\{b\}'}$ , then  $\text{FDS} := \text{FDS} \cup \{\alpha \rightarrow b\}$

# Algorithm

*(Inside loop)*

## Pruning

If FDS contains any functional dependency such that  $\beta \rightarrow b$  where  $\beta \subset \alpha$ , then skip

Example:

$\alpha = \{A, B\}$  (current entry in lattice),  $b = C$  (possible RHS)

If we found  $A \rightarrow C$ , then we can prune  $A, B \rightarrow C$  because we are guaranteed that it holds.

# Algorithm

- A partition with equivalent classes of size one removed denoted by  $\Pi^S$
- Example:  $\Pi^S_{\{\text{first}, \text{last}\}} = \Pi^S_{\{\text{first}\}} \cap \Pi^S_{\{\text{last}\}} = \{\{\dagger 1, \dagger 4\}\}$
- Intuitive explanation: a singleton equivalence class (size one) can never break any functional dependency on the left-hand side (Proof omitted)

## Stripped partitions

## Roadmap

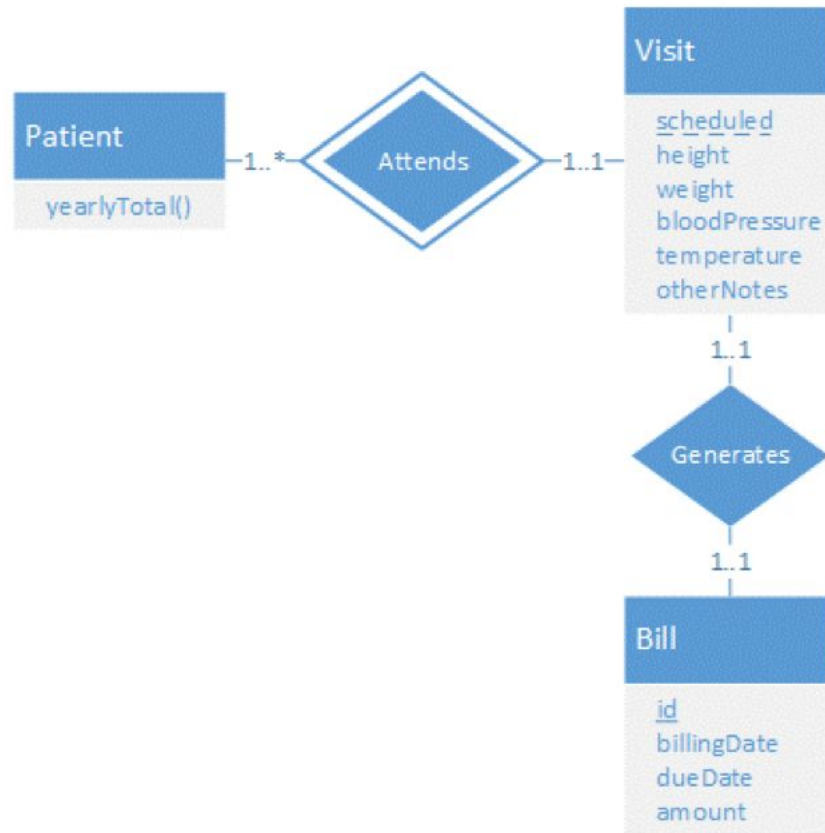
1. Introduction to normalization
2. Keys and functional dependencies
3. Normal forms and decomposition
4. Functional dependency discovery
5. Denormalization



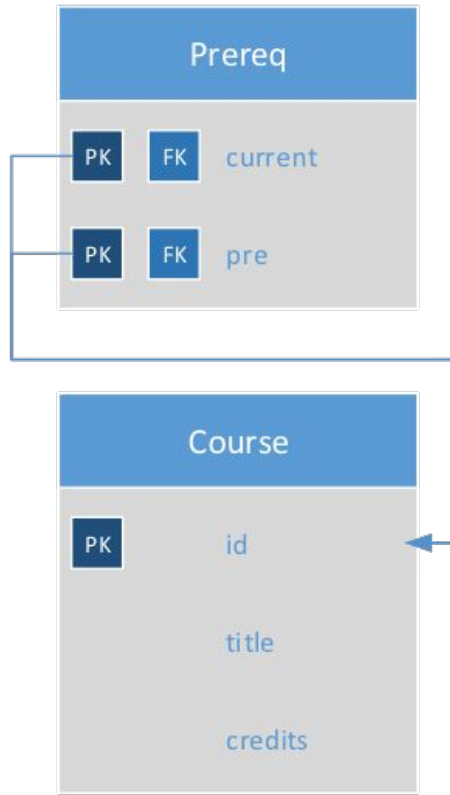
After normalization, we can update the logical model to introduce redundancy and (usually) improve performance

# Denormalization



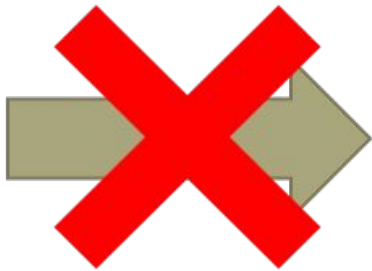


# Derived attributes



# Avoiding joins

Restaurant	
PK	id
	name
	city
	state



Restaurant_NY	
PK	id
	name
	city
	state

Restaurant_NJ	
PK	id
	name
	city
	state

Restaurant_ID	
PK	id
	name
	city
	state

# Discrimination

Department	
PK	id
	name
	budget



Department	
PK	id
	name
	budget_2007
	budget_2008
	budget_2009

# Crosstabs

## Computed Columns

- ▶ Sometimes we have a value which is expensive to compute and used in many queries
- ▶ In this case, we can use a *computed column* and ask the database to store the result when the row is changed

```
CREATE MATERIALIZED VIEW salaries_by_dept AS  
SELECT department, MIN(salary), MAX(salary)  
FROM Doctor GROUP BY department;
```

## CREATE MATERIALIZED VIEW

## Denormalization

- ▶ Should be used **very** sparingly in most database applications
- ▶ Like indexing, denormalization should be done for the benefit of queries
- ▶ Use database features to help with denormalization (e.g. triggers)
- ▶ Careful with possible anomalies!