

### Database Design and Normal Forms

#### Database Design

- coming up with a “good” schema is very important

How do we characterize the “goodness” of a schema ?

If two or more alternative schemas are available

how do we compare them ?

What are the problems with “bad” schema designs ?

#### Normal Forms:

Each normal form specifies certain conditions

If the conditions are satisfied by the schema

certain kind of problems are avoided

Details follow....

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### An Example

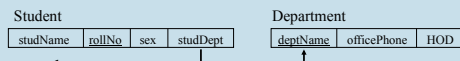
*student* relation with attributes: studName, rollNo, sex, studDept

*department* relation with attributes: deptName, officePhone, hod

Several students belong to a department.

studDept gives the name of the student’s department.

#### Correct schema:



#### Incorrect schema:



What are the problems that arise ?

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### Problems with bad schema

#### Redundant storage of data:

Office Phone & HOD info - stored redundantly

- once with each student that belongs to the department
- wastage of disk space

#### A program that updates Office Phone of a department

- must change it at several places
  - more running time
  - error - prone

#### Transactions running on a database

- must take as short time as possible to increase transaction throughput

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### Update Anomalies

Another kind of problems with bad schema

Insertion anomaly:

No way of inserting info about a new department unless we also enter details of a (dummy) student in the department

Deletion anomaly:

If all students of a certain department leave and we delete their tuples, information about the department itself is lost

Update Anomaly:

Updating officePhone of a department

- value in several tuples needs to be changed
- if a tuple is missed - inconsistency in data

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### Normal Forms

First Normal Form (1NF) - included in the definition of a relation

Second Normal Form (2NF)

Third Normal Form (3NF)

Boyce-Codd Normal Form (BCNF)

} defined in terms of  
functional dependencies

Fourth Normal Form (4NF) - defined using multivalued dependencies

Fifth Normal Form (5NF) or Project Join Normal Form (PJNF)  
defined using join dependencies

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### Functional Dependencies

A functional dependency (FD)  $X \rightarrow Y$  [where  $(X \subseteq R, Y \subseteq R)$ ]  
(read as  $X$  *determines*  $Y$ )

is said to hold on a schema  $R$  if

in *any* instance  $r$  on  $R$ ,

if two tuples  $t_1, t_2$  ( $t_1 \neq t_2, t_1 \in r, t_2 \in r$ )

agree on  $X$  i.e.  $t_1[X] = t_2[X]$

then they also agree on  $Y$  i.e.  $t_1[Y] = t_2[Y]$

$t_1[X]$  – the sub-tuple of  $t_1$  consisting of values of attributes in  $X$

Note: If  $K \subseteq R$  is a key for  $R$  then for any  $A \in R$ ,

$K \rightarrow A$

holds because the above if .....then condition is vacuously true

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### Functional Dependencies – Examples

Consider the schema:

Student(studName, rollNo, sex, dept, hostelName, roomNo)

Since rollNo is a key,  $\text{rollNo} \rightarrow \{\text{studName}, \text{sex}, \text{dept}, \text{hostelName}, \text{roomNo}\}$

Suppose that each student is given a hostel room exclusively, then  
 $\text{hostelName}, \text{roomNo} \rightarrow \text{rollNo}$

Suppose boys and girls are accommodated in separate hostels, then  
 $\text{hostelName} \rightarrow \text{sex}$

Does  $\text{Sex} \rightarrow \text{hostelName}$ ?

FDs are additional constraints that can be specified by designers

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### Trivial / Non-Trivial FDs and Notation

An FD  $X \rightarrow Y$  where  $Y \subseteq X$

- called a *trivial* FD, as it always holds good

An FD  $X \rightarrow Y$  where  $Y \not\subseteq X$

- *non-trivial* FD

An FD  $X \rightarrow Y$  where  $X \cap Y = \emptyset$

- *completely non-trivial* FD

Notational Convention:

(Low-end alphabets) A, B, C, D, ... and their subscripted versions

-- denote individual attributes

(High-end alphabets) Z, Y, X, W, ... and their subscripted versions

--- denote sets of attributes

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### FDs – Examples

Consider the scheme preRequisite(preReqCourse, courseId)

Does  $\text{preReqCourse} \rightarrow \text{courseId}$ ?

No, as a course might be pre-requisite for many courses

Does  $\text{courseId} \rightarrow \text{preReqCourse}$ ?

No, a course may have many pre-requisite courses

So, it is possible that no FDs hold on some schema

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### FDs – Examples

Consider the scheme:

Student-dept(rollNo, name, sex, deptName, officePhone, Hod)

The key is rollNo, so

$\text{rollNo} \rightarrow \text{name, sex, deptName, officePhone, Hod}$

Any more FDs hold?

$\text{deptName} \rightarrow \text{officePhone, Hod}$

$\text{Hod} \rightarrow \text{deptName, officePhone}$

(Assuming that each professor heads at most one department)

$\text{officePhone} \rightarrow \text{deptName, Hod}$

No other FDs hold

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### Deriving new FDs

Given that a set of FDs  $F$  holds on  $R$

we can infer that a certain new FD must also hold on  $R$

For instance,

given that  $X \rightarrow Y, Y \rightarrow Z$  hold on  $R$

we can infer that  $X \rightarrow Z$  must also hold

How to systematically obtain all such new FDs ?

Unless *all* FDs are known, a relation schema is not fully specified

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### Entailment Relation

We say that a set of FDs  $F \models \{X \rightarrow Y\}$

(read as  $F$  entails  $X \rightarrow Y$  or

$F$  logically implies  $X \rightarrow Y$

if in every instance  $r$  of  $R$  on which FDs  $F$  hold,  
FD  $X \rightarrow Y$  also holds.

Armstrong came up with several inference rules

for deriving new FDs from a given set of FDs

We define  $F^+ = \{X \rightarrow Y \mid F \models X \rightarrow Y\}$

$F^+$ : Closure of  $F$

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### Armstrong's Inference Rules (1/2) (aka Armstrong's Axioms)

#### 1. Reflexive rule

$F \models \{X \rightarrow Y \mid Y \subseteq X\}$  for any  $X$ . Trivial FDs

#### 2. Augmentation rule

$\{X \rightarrow Y\} \models \{XZ \rightarrow YZ\}, Z \subseteq R$ . Here,  $XZ$  denotes  $X \cup Z$

#### 3. Transitive rule

$\{X \rightarrow Y, Y \rightarrow Z\} \models \{X \rightarrow Z\}$

#### 4. Decomposition or Projective rule

$\{X \rightarrow YZ\} \models \{X \rightarrow Y\}$

#### 5. Union or Additive rule

$\{X \rightarrow Y, X \rightarrow Z\} \models \{X \rightarrow YZ\}$

#### 6. Pseudo transitive rule

$\{X \rightarrow Y, WY \rightarrow Z\} \models \{WX \rightarrow Z\}$

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### Armstrong's Inference Rules (2/2)

Rules 4, 5, 6 are not really necessary.

For instance, Rule 5:  $\{X \rightarrow Y, X \rightarrow Z\} \models \{X \rightarrow YZ\}$  can be  
*proved* using 1, 2, 3 alone

- 1)  $X \rightarrow Y$
- 2)  $X \rightarrow Z$
- 3)  $X \rightarrow XY$  Augmentation rule on 1
- 4)  $XY \rightarrow ZY$  Augmentation rule on 2
- 5)  $X \rightarrow ZY$  Transitive rule on 3, 4.

Similarly, 4, 6 can be shown to be unnecessary.  
But it is useful to have 4, 5, 6 as short-cut rules

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### Sound and Complete Inference Rules

Armstrong showed that

Rules (1), (2) and (3) are sound and complete.

These are called Armstrong's Axioms (AA)

$F_{AA} = \{X \rightarrow Y \mid X \rightarrow Y \text{ can be derived from } F \text{ using AA}\}$

Soundness: ( $F_{AA} \subseteq F^+$ )

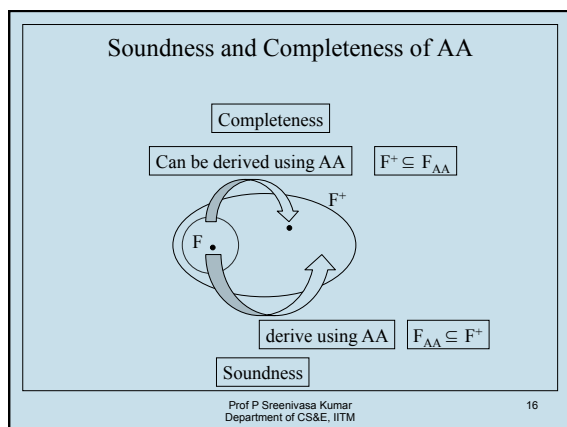
Every new FD  $X \rightarrow Y$  derived from a given set of FDs  $F$   
using Armstrong's Axioms is such that  $F \models \{X \rightarrow Y\}$

Completeness: ( $F^+ \subseteq F_{AA}$ )

Any FD  $X \rightarrow Y$  logically implied by  $F$  (i.e.  $F \models \{X \rightarrow Y\}$ )  
can be derived from  $F$  using Armstrong's Axioms

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**Proving Soundness**

Suppose  $X \rightarrow Y$  is derived from  $F$  using AA in some  $n$  steps. If each step is correct then overall deduction would be correct.

Single step: Apply Rule (1) or (2) or (3)

Rule (1) – Reflexive Rule. Obviously results in correct FDs

Rule (2) –  $\{X \rightarrow Y\} \models \{XZ \rightarrow YZ\}, Z \subseteq R$   
 Suppose  $t_1, t_2 \in r$  agree on  $XZ$   
 $\Rightarrow t_1, t_2$  agree on  $X$   
 $\Rightarrow t_1, t_2$  agree on  $Y$  (since  $X \rightarrow Y$  holds on  $r$ )  
 $\Rightarrow t_1, t_2$  agree as  $YZ$

Hence Rule (2) gives rise to correct FDs

Rule (3) –  $\{X \rightarrow Y, Y \rightarrow Z\} \models X \rightarrow Z$   
 Suppose  $t_1, t_2 \in r$  agree on  $X$   
 $\Rightarrow t_1, t_2$  agree on  $Y$  (since  $X \rightarrow Y$  holds)  
 $\Rightarrow t_1, t_2$  agree on  $Z$  (since  $Y \rightarrow Z$  holds)

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**Proving Completeness of Armstrong's Axioms (1/4)**

Define  $X_F^+$  (closure of  $X$  wrt  $F$ )  
 $= \{A \mid X \rightarrow A \text{ can be derived from } F \text{ using AA}\}, A \in R$   
 $X_F^+$  is the set of all attributes that occur on the rhs for an FD whose lhs is  $X$ , as per AA (wrt  $F$ )

Claim1:  
 $X \rightarrow Y$  can be derived from  $F$  using AA iff  $Y \subseteq X^+$

(If) Let  $Y = \{A_1, A_2, \dots, A_n\}, Y \subseteq X^+$   
 $\Rightarrow X \rightarrow A_i$  can be derived from  $F$  using AA ( $1 \leq i \leq n$ )  
 By union rule, it follows that  $X \rightarrow Y$  can be derived from  $F$ .

(Only If)  $X \rightarrow Y$  can be derived from  $F$  using AA  
 By projective rule  $X \rightarrow A_i$  ( $1 \leq i \leq n$ )  
 Thus by definition of  $X^+$ ,  $A_i \in X^+$   
 $\Rightarrow Y \subseteq X^+$

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### Completeness of Armstrong's Axioms (2/4)

Completeness:

$(F \models \{X \rightarrow Y\}) \Rightarrow X \rightarrow Y$  follows from F using AA

We will prove the contrapositive:

$X \rightarrow Y$  can't be derived from F using AA

$\Rightarrow F \not\models \{X \rightarrow Y\}$

$\Rightarrow \exists$  a relation instance r on R st all the FDs of F hold on r but  $X \rightarrow Y$  doesn't hold.

Consider the relation instance r with just two tuples:

$X^+$  attributes      Other attributes

r:  $\begin{array}{cccccccc} 1 & 1 & 1 & \dots & 1 & 1 & 1 & \dots & 1 \\ 1 & 1 & 1 & \dots & 1 & 0 & 0 & \dots & 0 \end{array}$

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### Completeness Proof (3/4)

Claim 2: All FDs of F are satisfied by r

Suppose not. Let  $W \rightarrow Z$  in F be an FD not satisfied by r

Then  $W \subseteq X^+$  and  $Z \notin X^+$

Let  $A \in Z - X^+$

Now,  $X \rightarrow W$  follows from F using AA as  $W \subseteq X^+$  (claim 1)

$X \rightarrow Z$  follows from F using AA by transitive rule

$Z \rightarrow A$  follows from F using AA by reflexive rule as  $A \in Z$

$X \rightarrow A$  follows from F using AA by transitive rule

By definition of closures, A must belong to  $X^+$

- a contradiction.

Hence the claim.

r:  $\begin{array}{cccccccc} 1 & 1 & 1 & \dots & 1 & 1 & 1 & \dots & 1 \\ 1 & 1 & 1 & \dots & 1 & 0 & 0 & \dots & 0 \end{array}$   
 $\underbrace{\hspace{1.5cm}}_{X^+} \quad \underbrace{\hspace{1.5cm}}_{R - X^+}$

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### Completeness Proof (4/4)

Claim 3:  $X \rightarrow Y$  is not satisfied by r

Suppose not

Because of the structure of r,  $Y \subseteq X^+$

$\Rightarrow X \rightarrow Y$  can be derived from F using AA

contradicting the assumption about  $X \rightarrow Y$

Hence the claim

Thus, whenever  $X \rightarrow Y$  doesn't follow from F using AA,

F doesn't logically imply  $X \rightarrow Y$

Armstrong's Axioms are complete.

r:  $\begin{array}{cccccccc} 1 & 1 & 1 & \dots & 1 & 1 & 1 & \dots & 1 \\ 1 & 1 & 1 & \dots & 1 & 0 & 0 & \dots & 0 \end{array}$   
 $\underbrace{\hspace{1.5cm}}_{X^+} \quad \underbrace{\hspace{1.5cm}}_{R - X^+}$

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### Consequence of Completeness of AA

$$\begin{aligned} X^+ &= \{A \mid X \rightarrow A \text{ follows from } F \text{ using AA}\} \\ &= \{A \mid F \models X \rightarrow A\} \end{aligned}$$

Similarly

$$\begin{aligned} F^+ &= \{X \rightarrow Y \mid F \models X \rightarrow Y\} \\ &= \{X \rightarrow Y \mid X \rightarrow Y \text{ follows from } F \text{ using AA}\} \end{aligned}$$

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### Computing closures

The size of  $F^+$  can sometimes be exponential in the size of  $F$ .

For instance,  $F = \{A \rightarrow B_1, A \rightarrow B_2, \dots, A \rightarrow B_n\}$

$F^+ = \{A \rightarrow X \mid \text{where } X \subseteq \{B_1, B_2, \dots, B_n\}\}$ .

Thus  $|F^+| = 2^n$

Computing  $F^+$ : computationally expensive

Fortunately, checking if  $X \rightarrow Y \in F^+$   
can be done by checking if  $Y \subseteq X_F^+$

Computing attribute closure ( $X_F^+$ ) is computationally easier

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### Computing $X_F^+$

We compute a sequence of sets  $X_0, X_1, \dots$  as follows:

$$\begin{aligned} X_0 &= X; \quad // X \text{ is the given set of attributes} \\ X_{i+1} &= X_i \cup \{A \mid \text{there is a FD } Y \rightarrow Z \text{ in } F \\ &\quad \text{such that } Y \subseteq X_i \text{ and } A \in Z\} \end{aligned}$$

To get new attributes into  $X_{i+1}$ , we use Transitive Rule and  
we can only use that!

Since  $X_0 \subseteq X_1 \subseteq X_2 \subseteq \dots \subseteq X_i \subseteq X_{i+1} \subseteq \dots \subseteq R$ , and  $R$  is finite,  
There is an integer  $i$  such that  $X_i = X_{i+1} = X_{i+2} = \dots$

$X_F^+$  is equal to such  $X_i$ .

Computing  $X_F^+$  can be done in polynomial time

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### Attribute Closures – An Example

Consider a scheme R and the FDs: (Data redundancy exists in R)

$R = (\text{rollNo}, \text{name}, \text{advisorId}, \text{advisorName}, \text{courseId}, \text{grade})$

FDs = {  $\text{rollNo} \rightarrow \text{name}$ ;  $\text{rollNo} \rightarrow \text{advisorId}$ ;  
 $\text{advisorId} \rightarrow \text{advisorName}$ ;  
 $\text{rollNo}, \text{courseId} \rightarrow \text{grade}$  }

$\{\text{rollNo}\}^+ = \{\text{rollNo}, \text{name}, \text{advisorId}, \text{advisorName}\}$

$\{\text{rollNo}, \text{courseId}\}^+ = \{\text{rollNo}, \text{name}, \text{advisorId}, \text{advisorName}, \text{courseId}, \text{grade}\} = R$

So  $\{\text{rollNo}, \text{courseId}\}$  is the key for R.

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### Normal Forms – 2NF

Full functional dependency:

An FD  $X \rightarrow A$  for which there is no proper subset Y of X such that  $Y \rightarrow A$

(A is said to be *fully functionally* dependent on X or )

2NF: A relation schema R is in 2NF if every *non-prime* attribute is fully functionally dependent on any key of R

Prime attribute: A attribute that is part of some key

Non-prime attribute: An attribute that is not part of any key

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### Example 1: 2NF

$\text{student}(\text{rollNo}, \text{name}, \text{dept}, \text{sex}, \text{hostelName}, \text{roomNo}, \text{admitYear})$

Assumptions:

Each student is allotted a single-occupancy room.

A room is identified by values of attributes  $\text{hostelName}, \text{roomNo}$ .

Boys and girls are accommodated in separate hostels.

Keys:  $\text{rollNo}, (\text{hostelName}, \text{roomNo})$

Not in 2NF as  $\text{hostelName} \rightarrow \text{sex}$

Decompose:

$\text{student}(\text{rollNo}, \text{name}, \text{dept}, \text{hostelName}, \text{roomNo}, \text{admitYear})$

$\text{hostelDetail}(\text{hostelName}, \text{sex})$

- These are both in 2NF

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**Example 2: 2NF**

book(authorName, title, authorAffiliation, ISBN, publisher, pubYear)

Assumptions: A book has exactly one author.

Author can be uniquely identified by value of attribute authorName  
AuthorAffiliation is the organization to which the author is *currently* associated with.

An author is associated with *exactly one* organization at any time.

Keys: (authorName, title), ISBN

Not in 2NF as  $\text{authorName} \rightarrow \text{authorAffiliation}$   
(authorAffiliation is not fully functionally dependent on the first key)

Decompose:

book(authorName, title, ISBN, publisher, pubYear)

authorInfo(authorName, authorAffiliation) -- both in 2NF

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**Transitive Dependencies**

Transitive dependency:

An FD  $X \rightarrow Y$  in a relation schema R for which there is a set of attributes  $Z \subseteq R$  such that

$X \rightarrow Z$  and  $Z \rightarrow Y$  and Z is not a subset of any key of R

studentDept(rollNo, name, dept, hostelName, roomNo, headDept)

Keys: rollNo, (hostelName, roomNo)

$\text{rollNo} \rightarrow \text{dept}$ ;  $\text{dept} \rightarrow \text{headDept}$  hold

So,  $\text{rollNo} \rightarrow \text{headDept}$  is a transitive dependency

Head of the dept of dept D is stored redundantly in every tuple where D appears.

Relation is in 2NF but redundancy still exists.

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**Normal Forms – 3NF**

Relation schema R is in 3NF if it is in 2NF and no non-prime attribute of R is transitively dependent on any key of R

studentDept(rollNo, name, dept, hostelname, roomNo, headDept)  
is not in 3NF

Decompose: student(rollNo, name, dept, hostelName, roomNo)  
deptInfo(dept, headDept)

both in 3NF

Redundancy in data storage - removed

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### Another definition of 3NF

Relation schema R is in 3NF if for any nontrivial FD  $X \rightarrow A$  either (i) X is a superkey or (ii) A is prime.

Suppose some R violates the above definition

$\Rightarrow$  There is an FD  $X \rightarrow A$  for which both (i) and (ii) are false

$\Rightarrow$  X is not a superkey and A is non-prime attribute

Two cases arise:

- 1) X is contained in a key – A is not fully functionally dependent on this key

- violation of 2NF condition

- 2) X is not contained in a key

$K \rightarrow X, X \rightarrow A$  is a case of transitive dependency

(K – any key of R)

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### Motivating example for BCNF

gradeInfo (rollNo, studName, course, grade)

Suppose the following FDs hold:

- 1) rollNo, course  $\rightarrow$  grade

Keys:

- 2) studName, course  $\rightarrow$  grade

(rollNo, course)

- 3) rollNo  $\rightarrow$  studName

(studName, course)

- 4) studName  $\rightarrow$  rollNo

(Assumption: No two students have the same name)

For 1, 2 lhs is a key. For 3, 4 rhs is prime; so gradeInfo is in 3NF

But studName is stored redundantly along with every course being done by the student.

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### Boyce - Codd Normal Form (BCNF)

Relation schema R is in BCNF if for every nontrivial FD  $X \rightarrow A$ , X is a superkey of R.

In gradeInfo, FDs 3, 4 are nontrivial but lhs is not a superkey  
So, gradeInfo is not in BCNF

Decompose:

gradeInfo (rollNo, course, grade)

studInfo (rollNo, studName)

Redundancy allowed by 3NF is disallowed by BCNF

BCNF is stricter than 3NF

3NF is stricter than 2NF

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### Decomposition of a relation schema

If R doesn't satisfy a particular normal form,  
we decompose R into smaller schemas

What's a decomposition?

$$R = (A_1, A_2, \dots, A_n)$$

$$D = (R_1, R_2, \dots, R_k) \text{ st } R_i \subseteq R \text{ and } R = R_1 \cup R_2 \cup \dots \cup R_k$$

( $R_i$ 's need not be disjoint)

Replacing R by  $R_1, R_2, \dots, R_k$  is the process of decomposing R

Ex: gradeInfo (rollNo, studName, course, grade)

$R_1$ : gradeInfo (rollNo, course, grade)

$R_2$ : studInfo (rollNo, studName)

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### Desirable Properties of Decompositions

Not all decomposition of a relational scheme R are useful

We require two properties to be satisfied

(i) Lossless join property

- the information in an instance r of R must be preserved in the instances  $r_1, r_2, \dots, r_k$  where  $r_i = \Pi_{R_i}(r)$

(ii) Dependency preserving property

- if a set F of dependencies hold on R it should be possible to enforce F on an instance r by enforcing appropriate dependencies on each  $r_i$

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### Lossless join property

F – set of FDs that hold on R

R – decomposed into  $R_1, R_2, \dots, R_k$

Decomposition is lossless wrt F if

for every relation instance r on R satisfying F,

$$r = \Pi_{R_1}(r) * \Pi_{R_2}(r) * \dots * \Pi_{R_k}(r)$$

$$R = (A, B, C); R_1 = (A, B); R_2 = (B, C)$$

r:	A	B	C	r <sub>1</sub> :	A	B	r <sub>2</sub> :	B	C	r <sub>1</sub> *r <sub>2</sub> :	A	B	C
	a <sub>1</sub>	b <sub>1</sub>	c <sub>1</sub>	a <sub>1</sub>	b <sub>1</sub>		b <sub>1</sub>	c <sub>1</sub>			a <sub>1</sub>	b <sub>1</sub>	c <sub>1</sub>
	a <sub>2</sub>	b <sub>2</sub>	c <sub>2</sub>	a <sub>2</sub>	b <sub>2</sub>		b <sub>2</sub>	c <sub>2</sub>			a <sub>2</sub>	b <sub>2</sub>	c <sub>2</sub>
	a <sub>3</sub>	b <sub>1</sub>	c <sub>3</sub>	a <sub>3</sub>	b <sub>1</sub>		b <sub>1</sub>	c <sub>3</sub>			a <sub>3</sub>	b <sub>1</sub>	c <sub>3</sub>
Lossy join											a <sub>3</sub>	b <sub>1</sub>	c <sub>2</sub>

Spurious tuples

Lossless joins  
are also called  
non-additive joins

Original info  
is distorted

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### Dependency Preserving Decompositions

Decomposition  $D = (R_1, R_2, \dots, R_k)$  of schema  $R$  *preserves* a set of dependencies  $F$  if

$$(\Pi_{R_1}(F) \cup \Pi_{R_2}(F) \cup \dots \cup \Pi_{R_k}(F))^+ = F^+$$

Here,  $\Pi_{R_i}(F) = \{ (X \rightarrow Y) \in F^+ \mid X \subseteq R_i, Y \subseteq R_i \}$   
(called projection of  $F$  onto  $R_i$ )

Informally, any FD that logically follows from  $F$  must also logically follow from the union of projections of  $F$  onto  $R_i$ 's. Then,  $D$  is called dependency preserving.

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### An example

Schema  $R = (A, B, C)$

FDs  $F = \{A \rightarrow B, B \rightarrow C, C \rightarrow A\}$

Decomposition  $D = (R_1 = \{A, B\}, R_2 = \{B, C\})$

$\Pi_{R_1}(F) = \{A \rightarrow B, B \rightarrow A\}$

$\Pi_{R_2}(F) = \{B \rightarrow C, C \rightarrow B\}$

$$(\Pi_{R_1}(F) \cup \Pi_{R_2}(F))^+ = \{A \rightarrow B, B \rightarrow A, \\ B \rightarrow C, C \rightarrow B, \\ A \rightarrow C, C \rightarrow A\} = F^+$$

Hence Dependency preserving

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### Testing for lossless decomposition property(1/6)

$R$  – given schema with attributes  $A_1, A_2, \dots, A_n$

$F$  – given set of FDs

$D = \{R_1, R_2, \dots, R_m\}$  given decomposition of  $R$

Is  $D$  a lossless decomposition?

Create an  $m \times n$  matrix  $S$  with columns labeled as  $A_1, A_2, \dots, A_n$   
and rows labeled as  $R_1, R_2, \dots, R_m$

Initialize the matrix as follows:

set  $S(i, j)$  as symbol  $b_{ij}$  for all  $i, j$ .

if  $A_j$  is in the scheme  $R_i$ , then set  $S(i, j)$  as symbol  $a_j$ , for all  $i, j$

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## Testing for lossless decomposition property(2/6)

After  $S$  is initialized, we carry out the following process on it:

**repeat**

**for each** functional dependency  $U \rightarrow V$  in  $F$  **do**

**for all** rows in  $S$  which agree on  $U$ -attributes **do**

make the symbols in each  $V$ -attribute column

the *same* in all the rows as follows:

if any of the rows has an " $a$ " symbol for the column

set the other rows to the same " $a$ " symbol in the column

else // if no " $a$ " symbol exists in any of the rows

choose one of the " $b$ " symbols that appears

in one of the rows for the  $V$ -attribute and

set the other rows to that " $b$ " symbol in the column

**until** no changes to  $S$

At the end, if there exists a row with all " $a$ " symbols then  $D$  is lossless otherwise  $D$  is a lossy decomposition

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## Testing for lossless decomposition property(3/6)

$R = (\text{rollNo}, \text{name}, \text{advisor}, \text{advisorName}, \text{course}, \text{grade})$

$FD' s = \{ \text{rollNo} \rightarrow \text{name}; \text{rollNo} \rightarrow \text{advisor}; \text{advisor} \rightarrow \text{advisorName}$   
 $\text{rollNo}, \text{course} \rightarrow \text{grade} \}$

$D : \{ R_1 = (\text{rollNo}, \text{name}, \text{advisor}), R_2 = (\text{advisor}, \text{advisorName}),$   
 $R_3 = (\text{rollNo}, \text{course}, \text{grade}) \}$

Matrix  $S$  : (Initial values)

	rollNo	name	advisor	advisor Name	course	grade
$R_1$	$a_1$	$a_2$	$a_3$	$b_{14}$	$b_{15}$	$b_{16}$
$R_2$	$b_{21}$	$b_{22}$	$a_3$	$a_4$	$b_{25}$	$b_{26}$
$R_3$	$a_1$	$b_{32}$	$b_{33}$	$b_{34}$	$a_5$	$a_6$

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## Testing for lossless decomposition property(4/6)

$R = (\text{rollNo}, \text{name}, \text{advisor}, \text{advisorDept}, \text{course}, \text{grade})$

$FD' s = \{ \text{rollNo} \rightarrow \text{name}; \text{rollNo} \rightarrow \text{advisor}; \text{advisor} \rightarrow \text{advisorName}$   
 $\text{rollNo}, \text{course} \rightarrow \text{grade} \}$

$D : \{ R_1 = (\text{rollNo}, \text{name}, \text{advisor}), R_2 = (\text{advisor}, \text{advisorName}),$   
 $R_3 = (\text{rollNo}, \text{course}, \text{grade}) \}$

Matrix  $S$  : (After enforcing  $\text{rollNo} \rightarrow \text{name}$  &  $\text{rollNo} \rightarrow \text{advisor}$ )

	rollNo	name	advisor	advisor Name	course	grade
$R_1$	$a_1$	$a_2$	$a_3$	$b_{14}$	$b_{15}$	$b_{16}$
$R_2$	$b_{21}$	$b_{22}$	$a_3$	$a_4$	$b_{25}$	$b_{26}$
$R_3$	$a_1$	$b_{32}$	$b_{33}$	$b_{34}$	$a_5$	$a_6$

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## Testing for lossless decomposition property(5/6)

$R = (\text{rollNo}, \text{name}, \text{advisor}, \text{advisorDept}, \text{course}, \text{grade})$   
 $\text{FD's} = \{\text{rollNo} \rightarrow \text{name}; \text{rollNo} \rightarrow \text{advisor}; \text{advisor} \rightarrow \text{advisorName}$   
 $\text{rollNo}, \text{course} \rightarrow \text{grade}\}$   
 $D : \{ R_1 = (\text{rollNo}, \text{name}, \text{advisor}), R_2 = (\text{advisor}, \text{advisorName}),$   
 $R_3 = (\text{rollNo}, \text{course}, \text{grade}) \}$

Matrix S : (After enforcing  $\text{advisor} \rightarrow \text{advisorName}$ )

	rollNo	name	advisor	advisor Name	course	grade
$R_1$	$a_1$	$a_2$	$a_3$	$b_{14}a_4$	$b_{15}$	$b_{16}$
$R_2$	$b_{21}$	$b_{22}$	$a_3$	$a_4$	$b_{25}$	$b_{26}$
$R_3$	$a_1$	$b_{32}a_2$	$b_{33}a_3$	$b_{34}a_4$	$a_5$	$a_6$

No more changes. Third row with all  $a$  symbols. So a lossless join.

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## Testing for lossless decomposition property(6/6)

$R$  – given schema.  $F$  – given set of FDs

The decomposition of  $R$  into  $R_1, R_2$  is lossless wrt  $F$  if and only if  
 either  $R_1 \cap R_2 \rightarrow (R_1 - R_2)$  belongs to  $F^+$  or  
 $R_1 \cap R_2 \rightarrow (R_2 - R_1)$  belongs to  $F^+$

Example:

$\text{gradeInfo}(\text{rollNo}, \text{studName}, \text{course}, \text{grade})$   
 with FDs =  $\{\text{rollNo}, \text{course} \rightarrow \text{grade}; \text{studName}, \text{course} \rightarrow \text{grade};$   
 $\text{rollNo} \rightarrow \text{studName}; \text{studName} \rightarrow \text{rollNo}\}$   
 decomposed into  
 $\text{grades}(\text{rollNo}, \text{course}, \text{grade})$  and  $\text{studInfo}(\text{rollNo}, \text{studName})$   
 is lossless because  
 $\text{rollNo} \rightarrow \text{studName}$

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## A property of lossless joins

$D_1: (R_1, R_2, \dots, R_k)$  lossless decomposition of  $R$  wrt  $F$

$D_2: (R_{i1}, R_{i2}, \dots, R_{ip})$  lossless decomposition of  $R_i$  wrt  $F_i = \Pi_{R_i}(F)$

Then

$D = (R_1, R_2, \dots, R_{i-1}, R_{i1}, R_{i2}, \dots, R_{ip}, R_{i+1}, \dots, R_k)$  is a  
 lossless decomposition of  $R$  wrt  $F$

This property is useful in the algorithm for BCNF decomposition

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### Algorithm for BCNF decomposition

$R$  – given schema.  $F$  – given set of FDs

```

D = {R} // initial decomposition
while there is a relation schema  $R_i$  in D that is not in BCNF do
{ let  $X \rightarrow A$  be the FD in  $R_i$  violating BCNF;
  Replace  $R_i$  by  $R_{i1} = R_i - \{A\}$  and  $R_{i2} = X \cup \{A\}$  in D;
}

```

Decomposition of  $R_i$  is lossless as

$$R_{i1} \cap R_{i2} = X, R_{i2} - R_{i1} = A \text{ and } X \rightarrow A$$

Result: a lossless decomposition of  $R$  into BCNF relations

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### Dependencies may not be preserved (1/2)

Consider the schema: townInfo (stateName, townName, distName)  
with the FDs  $F$ :  $ST \rightarrow D$  (town names are unique within a state)  
 $D \rightarrow S$  (district names are unique across states)

Keys:  $ST, DT$  – all attributes are prime  
– relation is in 3NF

Relation is not in BCNF as  $D \rightarrow S$  and  $D$  is not a key

Decomposition given by algorithm:  $R_1: TD$   $R_2: DS$

Not dependency preserving as  $\Pi_{R_1}(F) = \text{trivial dependencies}$

$$\Pi_{R_2}(F) = \{D \rightarrow S\}$$

Union of these doesn't imply  $ST \rightarrow D$

$ST \rightarrow D$  can't be enforced unless we perform a join.

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### Dependencies may not be preserved (2/2)

Consider the schema:  $R(A, B, C)$

with the FDs  $F$ :  $AB \rightarrow C$  and  $C \rightarrow B$

Keys:  $AB, AC$  – relation in 3NF (all attributes are prime)

– Relation is not in BCNF as  $C \rightarrow B$  and  $C$  is not a key

Decomposition given by algorithm:  $R_1: CB$   $R_2: AC$

Not dependency preserving as  $\Pi_{R_1}(F) = \text{trivial dependencies}$

$$\Pi_{R_2}(F) = \{C \rightarrow B\}$$

Union of these does not entail  $AB \rightarrow C$

All possible decompositions:  $\{AB, BC\}, \{BA, AC\}, \{AC, CB\}$

Only the last one is lossless!

Lossless and dependency-preserving decomposition doesn't exist.

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### Equivalent Dependency Sets

$F, G$  – two sets of FDs on schema  $R$

$F$  is said to **cover**  $G$  if  $G \subseteq F^+$  (equivalently  $G^+ \subseteq F^+$ )

$F$  is equivalent to  $G$  if  $F^+ = G^+$  (or,  $F$  covers  $G$  and  $G$  covers  $F$ )

Note: To check if  $F$  covers  $G$ ,

it's enough to show that for each FD  $X \rightarrow Y$  in  $G$ ,  $Y \subseteq X_F^+$

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### Canonical covers or Minimal covers

It is of interest to reduce a set of FDs  $F$  into a 'standard' form  $F'$  such that  $F'$  is equivalent to  $F$ .

We define that a set of FDs  $F$  is in '*minimal form*' if

(i) the rhs of any FD of  $F$  is a single attribute

(ii) there are no redundant FDs in  $F$

that is, there is no FD  $X \rightarrow A$  in  $F$

s.t  $(F - \{X \rightarrow A\})$  is equivalent to  $F$

(iii) there are no redundant attributes on the lhs of any FD in  $F$

that is, there is no FD  $X \rightarrow A$  in  $F$  s.t there is  $Z \subset X$  for which

$F - \{X \rightarrow A\} \cup \{Z \rightarrow A\}$  is equivalent to  $F$

**Minimal Covers**

useful in obtaining a lossless, dependency-preserving decomposition of a scheme  $R$  into 3NF relation schemas

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### Algorithm for computing a minimal cover

$R$  – given Schema or set of attributes;  $F$  – given set of FDs on  $R$

Step 1:  $G := F$

Step 2: Replace every fd of the form  $X \rightarrow A_1 A_2 A_3 \dots A_k$  in  $G$  by  $X \rightarrow A_1; X \rightarrow A_2; X \rightarrow A_3; \dots; X \rightarrow A_k$

Step 3: For each fd  $X \rightarrow A$  in  $G$  do  
for each  $B$  in  $X$  do

if  $(G - \{X \rightarrow A\} + \{(X - B) \rightarrow A\})^+ = F^+$  then

replace  $X \rightarrow A$  by  $(X - B) \rightarrow A$

Step 4: For each fd  $X \rightarrow A$  in  $G$  do

if  $(G - \{X \rightarrow A\})^+ = G^+$  then

replace  $G$  by  $G - \{X \rightarrow A\}$

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### Computing Minimal Covers

Example from Elmasri and Navathe, Database Systems (6<sup>th</sup> edition)

Determine the minimal cover for  $F = \{ B \rightarrow A, D \rightarrow A, AB \rightarrow D \}$

All rhs sets are single attributes. So, Step 2 changes nothing.

If  $G = \{ B \rightarrow A, D \rightarrow A, B \rightarrow D \}$ , we find that  $G^+ = F^+$

In  $G$ , since  $B \rightarrow D$ ,  $AB \rightarrow AD$  and hence  $AB \rightarrow D$

So  $AB \rightarrow D$  belongs to  $G^+$ . Hence  $G$  covers  $F$

In  $F$ , since  $B \rightarrow A$ ,  $B \rightarrow AB$ .

Since  $B \rightarrow AB$ ,  $AB \rightarrow D$ , we get  $B \rightarrow D$ . So  $B \rightarrow D$  is in  $F^+$ .

Hence  $F$  covers  $G$ .

Finally, in  $G$ , we find that  $B \rightarrow A$  can be obtained for the other two.

Hence,  $\{ D \rightarrow A, B \rightarrow D \}$  is a minimal cover for  $F$

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### 3NF Decomposition Algorithm

$R$  – given Schema;  $F$  – given set of fd's on  $R$  in *minimal form*

Use BCNF algorithm to get a lossless decomposition  $D = (R_1, R_2, \dots, R_k)$

Note: each  $R_i$  is already in 3NF (it is in BCNF in fact!)

Algorithm: Let  $G$  be the set of fd's not preserved in  $D$

For each fd  $Z \rightarrow A$  that is in  $G$

Add relation scheme  $S = (B_1, B_2, \dots, B_s, A)$  to  $D$ . //  $Z = \{B_1, B_2, \dots, B_s\}$

As  $Z \rightarrow A$  is in  $F$  which is a minimal cover,

there is no proper subset  $X$  of  $Z$  s.t  $X \rightarrow A$ . So  $Z$  is a key for  $S$ !

Any other fd  $X \rightarrow C$  on  $S$  is such that  $C$  is in  $\{B_1, B_2, \dots, B_s\}$ .

Such fd's do not violate 3NF because each  $B_i$ 's is prime attribute!

Thus any scheme  $S$  added to  $D$  as above is in 3NF.

$D$  continues to be lossless even when we add new schemas to it!

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### Multi-valued Dependencies (MVDs) and 4NF

**studCoursesAndFriends(rollNo, courseNo, frndEmailAddr)**

A student enrolls for several courses and has several friends whose email addresses we want to record.

If rows (CS05B007, CS370, shyam@gmail.com) and

(CS05B007, CS376, radha@yahoo.com) appear then

rows (CS05B007, CS376, shyam@gmail.com)

(CS05B007, CS370, radha@yahoo.com) should also appear!

For, otherwise, it implies that having "shyam" as a friend has something to do with doing course CS370!

Causes a huge amount of data redundancy!

Since there are no non-trivial FD's, the scheme is in BCNF

We say that MVD  $\text{rollNo} \twoheadrightarrow \text{courseNo}$  holds

(read as rollNo *multi-determines* courseNo)

By symmetry,  $\text{rollNo} \twoheadrightarrow \text{frndEmailAddr}$  also holds

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### More about MVDs

Consider  $\text{studCourseGrade}(\text{rollNo}, \text{courseNo}, \text{grade})$

Note that  $\text{rollNo} \twoheadrightarrow \text{courseNo}$  *does not* hold here even though  $\text{courseNo}$  is a multi-valued attribute of a student entity

If  $(\text{CS05B007}, \text{CS370}, \text{A})$

$(\text{CS05B007}, \text{CS376}, \text{B})$  appear in the data then

$(\text{CS05B007}, \text{CS376}, \text{A})$

$(\text{CS05B007}, \text{CS370}, \text{B})$  will not appear !!

Attribute 'grade' depends on  $(\text{rollNo}, \text{courseNo})$

MVD's arise when two or more *unrelated* multi-valued attributes of an entity are sought to be represented together in a scheme.

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### More about MVDs

Consider

$\text{studCourseAdvisor}(\text{rollNo}, \text{courseNo}, \text{advisor})$

Note that  $\text{rollNo} \twoheadrightarrow \text{courseNo}$  *holds* here

If  $(\text{CS05B007}, \text{CS370}, \text{Dr Ravi})$

$(\text{CS05B007}, \text{CS376}, \text{Dr Ravi})$  appear in the data then

swapping  $\text{courseNo}$  values gives rise to existing rows only.

But, since  $\text{rollNo} \rightarrow \text{advisor}$  and  $(\text{rollNo}, \text{courseNo})$  is the key, this gets caught in checking for 2NF itself.

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### MVD Definition

Consider a scheme  $R(X, Y, Z)$ ,

An MVD  $X \twoheadrightarrow Y$  holds on  $R$  if, for in any instance of  $R$ , the presence of two tuples

$(xxx, y1y1y1, z1z1z1)$  and

$(xxx, y2y2y2, z2z2z2)$

guarantees the presence of tuples

$(xxx, y1y1y1, z2z2z2)$  and

$(xxx, y2y2y2, z1z1z1)$

Note that every FD on  $R$  is also an MVD!

- the notion of MVD's generalizes the notion of FD's

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### Alternative definition of MVDs

Consider  $R(\underline{X}, Y, Z)$

Suppose that  $X \twoheadrightarrow Y$  and by symmetry  $X \twoheadrightarrow Z$

Then, decomposition  $D = (XY, XZ)$  of  $R$  should be lossless

That is, for any instance  $r$  on  $R$ ,  $r = \Pi_{XY}(r) * \Pi_{XZ}(r)$

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### MVDs and 4NF

An MVD  $X \twoheadrightarrow Y$  on scheme  $R$  is called *trivial* if either  
 $Y \subseteq X$  or  $R = X \cup Y$ . Otherwise, it is called *non-trivial*.

**4NF:** A relation  $R$  is in 4NF if it is in BCNF and for every  
nontrivial MVD  $X \twoheadrightarrow A$ ,  $X$  must be a superkey of  $R$ .

`studCourseEmail(rollNo, courseNo, frndEmailAddr)`

is not in 4NF as

$\text{rollNo} \twoheadrightarrow \text{courseNo}$  and

$\text{rollNo} \twoheadrightarrow \text{frndEmailAddr}$

are both nontrivial and  $\text{rollNo}$  is not a superkey for the  
relation

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### Join Dependencies and 5NF

A join dependency (JD) is generalization of an MVD

A JD  $JD(R_1, R_2, \dots, R_k)$  is said to hold on schema  $R$  if

for every instance  $r = *(\Pi_{R_1}(r), \Pi_{R_2}(r), \dots, \Pi_{R_k}(r))$

Here,  $R = R_1 \cup R_2 \cup \dots \cup R_k$  and Natural join  $*$  is a multi-way join.

A JD is difficult to detect in practice. It occurs in rare situations.

A relational scheme is said to be in 5NF wrt to a set of FDs, MVDs  
and JDs if it is in 4NF and for every non-trivial  $JD(R_1, R_2, \dots, R_k)$ ,  
each  $R_i$  is a superkey.

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### Join Dependencies – An Example

Consider the following relation:

**studProjSkill**(rollNo, skill, project) and the three relations

**studSkill**(rollNo, skill) // who has what skill

**studProj**(rollNo, project) // who is interested in what project

**skillProj**(project, skill) // which project requires what skills

Suppose there is a rule that:

If a student  $r1$  has skill  $s1$ , and  $r1$  is interested in project  $p1$  and project  $p1$  requires skill  $s1$  then  $(r1, s1, p1)$  *must be* in studProjSkill

In other words,  $\text{studProjSkill} = * (\text{studSkill}, \text{studProj}, \text{skillProj})$

Then, we say  $\text{JD}(\text{studSkill}, \text{studProj}, \text{skillProj})$  holds

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### Example - Observations

rollNo	skill
r1	s1
r1	s2

Size  $\leq rs$

rollNo	project
r1	p1
r1	p2

Size  $\leq rp$

project	skill
p1	s1
p2	s3

Size  $\leq sp$

rollNo	project	skill
r1	p1	s1

Size  $\leq rps$

There are no MVDs in 3-column table

#students =  $r$ , #projects =  $p$ , #skills =  $s$   
 $rps \gg rp + sp + rs$

Huge amount of data redundancy exists

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### Relational DB Design - Approaches

Two Approaches: Bottom-up and Top-down

Bottom-up Approach ( aka Synthesis Approach)

- Keep all attributes in a universal relation
- Determine *all* the FDs, MVDs, applicable
- Use the algorithms discussed to decompose the universal relation
- Obtain a design using the algorithms discussed

Drawbacks of the approach

- Difficult to obtain *all* the FDs in a large DB with 100s of attributes
- Algorithms are non-deterministic
- Not popular in practice

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### Relational DB Design - Approaches

Top-down Approach ( aka Analysis Approach)

- Represent Entities/Relationships as relations
  - Group attributes that belong naturally together
- Determine the FDs, MVDs, applicable among attributes
- Analyze the relations individually and also collectively
  - If necessary carry out decomposition to obtain desirable properties
- More popular approach
- Theoretical observations are applicable to both approaches

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