

# CS150A Database

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Today:

- Database Design II:
  - Functional Dependencies
  - Normalization

Readings:

- Database Management Systems (DBMS), Chapter 19

# Steps in Database Design, cont

- Requirements Analysis
  - user needs; what must database do?
- Conceptual Design
  - *high level description (often done w/ER model)*  Completed
  - ORM encourages you to program here
- Logical Design
  - translate ER into DBMS data model  Completed
  - ORMs often require you to help here too
- **Schema Refinement**  You are here
  - **consistency, normalization**
- Physical Design - indexes, disk layout
- Security Design - who accesses what, and how

# An Overview

The Evil to Avoid: Redundancy in your schema

- i.e. replicated values
- leads to wasted storage
- Far more important: insert/delete/update **anomalies**
  - Replicated data + change = Trouble.
  - We'll see examples shortly

# An Overview cont

- Solution: Functional Dependencies
  - a form of integrity constraints
  - help identify redundancy in schemas
  - help suggest refinements
- Main refinement technique: Decomposition
  - split the columns of one table into two tables
  - often good, but need to do this judiciously

# Functional Dependencies (FDs)

- Idea:  $X \rightarrow Y$  means
  - (Read “ $\rightarrow$ ” as “determines”)
  - Given any two tuples in table  $r$ ,  
if their  $X$  values are the same,  
then their  $Y$  values must be the same.  
(but not vice versa)

X	Y	Z
2	4	1
2	?	2
3	4	1

# FD's Continued

- Formally: An FD  $X \rightarrow Y$  holds over relation schema  $R$  if, for every allowable instance  $r$  of  $R$ :
  - $t1 \in r, t2 \in r, \pi_X(t1) = \pi_X(t2) \Rightarrow \pi_Y(t1) = \pi_Y(t2)$
  - ( $t1, t2$  are tuples;  $X, Y$  are sets of attributes)
- An FD is w.r.t. ***all*** allowable instances.
  - Declared based on app semantics
  - Not learned from data
    - (though you might learn suggestions for FDs)

# Important: key terminology

- Question: How are FDs related to primary keys?
  - **Primary Keys are special cases of FDs**
  - $K \rightarrow \{\text{all attributes}\}$
- Superkey: a set of columns that determines all the columns in its table
  - $K \rightarrow \{\text{all attributes}\}$ . (Also sometimes just called a key)
- Candidate Key: a **minimal** set of columns that determines all columns in its table
  - $K \rightarrow \{\text{all attributes}\}$
  - For any  $L \subset K$ ,  $L \not\rightarrow \{\text{all attributes}\}$  (minimal)
- Primary Key: a single chosen candidate key
- Index/sort “key” : columns used in an index or sort.
  - Unrelated to FDs, dependencies.

# Example: Constraints on Entity Set

- Consider relation Hourly\_Emps:  
Hourly\_Emps (ssn, name, lot, rating, wage\_per\_hr, hrs\_per\_wk)
- We can denote a relation schema by listing its attributes:
  - e.g., SNLRWH
  - This is really the set of attributes {S,N,L,R,W,H}.
- And we can use relation name to refer to the set of all its attributes
  - e.g., “Hourly\_Emps” for SNLRWH
- What are some FDs on Hourly\_Emps?
  - **ssn** is the primary key:  $S \rightarrow \text{SNLRWH}$
  - **rating** determines *wage\_per\_hr*:  $R \rightarrow W$
  - **lot** determines *lot*:  $L \rightarrow L$  (“trivial” dependency)



# So What??

- How do FDs help us think about the Evils of Redundancy?
- Let's connect FDs and Evils of Redundancy in our example...

# Problem 1 Due to $R \rightarrow W$

- **Update anomaly**: Can we modify W in only the 1st tuple of SNLRWH?

*Ha! Then that tuple will be inconsistent  
with Smiley and Madayan!*

S	N	L	R	W	H
123-22-3666	Attishoo	48	8	10	40
231-31-5368	Smiley	22	8	10	30
131-24-3650	Smethurst	35	5	7	30
434-26-3751	Guldu	35	5	7	32
612-67-4134	Madayan	35	8	10	40

# Problem 2 Due to $R \rightarrow W$

- **Insertion anomaly**: What if we want to insert an employee and don't know the hourly wage for his or her rating? (or we get it wrong?)

*Ha! Then you will have to invent a value without reference to established truth!*

S	N	L	R	W	H
123-22-3666	Attishoo	48	8	10	40
231-31-5368	Smiley	22	8	10	30
131-24-3650	Smethurst	35	5	7	30
434-26-3751	Guldu	35	5	7	32
612-67-4134	Madayan	35	8	10	40

# Problem 3 Due to $R \rightarrow W$

- **Deletion anomaly**: If we delete all employees with rating 5, we lose the information about the wage for rating 5!

*Ha! Then you will forget established truth!*

S	N	L	R	W	H
123-22-3666	Attishoo	48	8	10	40
231-31-5368	Smiley	22	8	10	30
131-24-3650	Smethurst	35	5	7	30
434-26-3751	Guldu	35	5	7	32
612-67-4134	Madayan	35	8	10	40

# Detecting Redundancy

- Q: Why is  $R \rightarrow W$  problematic, but  $S \rightarrow W$  not?
- A: R is not a key, so any pair ((8, 10) for example) can appear multiple times. S is a **candidate key**, so each pair (e.g., (123-22-3666, 10)) is stored exactly once.

Hourly\_Emps

S	N	L	R	W	H
123-22-3666	Attishoo	48	8	10	40
231-31-5368	Smiley	22	8	10	30
131-24-3650	Smethurst	35	5	7	30
434-26-3751	Guldu	35	5	7	32
612-67-4134	Madayan	35	8	10	40

# Decomposing a Relation

- Redundancy can be removed by “chopping” the relation into pieces.
- FD's are used to drive this process.
  - $R \rightarrow W$  is causing the problems, so decompose SNLRWH into what relations?

S	N	L	R	H
123-22-3666	Attishoo	48	8	40
231-31-5368	Smiley	22	8	30
131-24-3650	Smethurst	35	5	30
434-26-3751	Guldu	35	5	32
612-67-4134	Madayan	35	8	40

Hourly\_Emps2

R	W
8	10
5	7

Wages

# Reasoning About FDs: Examples

- Given some FDs, we can usually infer additional FDs:
  - $\text{bookID} \rightarrow (\text{publisher}, \text{author})$  implies  $\text{bookID} \rightarrow \text{publisher}$   
and  $\text{bookID} \rightarrow \text{author}$
  - $\text{bookID} \rightarrow \text{publisher}$  and  $\text{bookID} \rightarrow \text{author}$  implies  $\text{bookID} \rightarrow (\text{publisher}, \text{author})$
  - $\text{bookID} \rightarrow \text{author}$  and  $\text{author} \rightarrow \text{publisher}$  implies  $\text{bookID} \rightarrow \text{publisher}$
- But,  
 $(\text{title}, \text{author}) \rightarrow \text{publisher}$  does NOT necessarily imply that  
 $\text{title} \rightarrow \text{publisher}$  NOR that  $\text{author} \rightarrow \text{publisher}$

# Reasoning About FDs: General

- Generally, an FD  $g$  is implied by a set of FDs  $F$  if  $g$  holds whenever all FDs in  $F$  hold.
- $F^+$  = closure of  $F$ :
  - the set of all FDs that are implied by  $F$ .
  - includes “trivial dependencies”



# Rules of Inference

- **Armstrong's Axioms** ( $X, Y, Z$  are sets of attributes):
  - Reflexivity: If  $X \supseteq Y$ , then  $X \rightarrow Y$
  - Augmentation: If  $X \rightarrow Y$ , then  $XZ \rightarrow YZ$  for any  $Z$
  - Transitivity: If  $X \rightarrow Y$  and  $Y \rightarrow Z$ , then  $X \rightarrow Z$
- Sound and complete inference rules for FDs!
  - using AA you get only the FDs in  $F^+$  and all these FDs.
- Some additional rules (that follow from AA):
  - Union: If  $X \rightarrow Y$  and  $X \rightarrow Z$ , then  $X \rightarrow YZ$
  - Decomposition: If  $X \rightarrow YZ$ , then  $X \rightarrow Y$  and  $X \rightarrow Z$
  - See if you can prove these!

# Example

- **Contracts(cid,sid,jid,did,pid,qty,value), and:**
  - C is the key:  $C \rightarrow CSJDPQV$
  - Proj (J) purchases each part (P) using single contract (C):  $JP \rightarrow C$
  - Dept (D) purchases at most 1 part (P) from a supplier (S):  $SD \rightarrow P$
- **Problem: Prove that SDJ is a key for Contracts**
- $JP \rightarrow C, C \rightarrow CSJDPQV$ 
  - Imply  $JP \rightarrow CSJDPQV$
  - (by transitivity) (shows that JP is a key)
- $SD \rightarrow P$ 
  - implies  $SDJ \rightarrow JP$  (by augmentation)
- $SDJ \rightarrow JP, JP \rightarrow CSJDPQV$ 
  - imply  $SDJ \rightarrow CSJDPQV$
  - (by transitivity) (shows that SDJ is a key).
- Q: can you now infer that  $SD \rightarrow CSDPQV$ 
  - No

# Attribute Closure

- Computing closure  $F^+$  of a set of FDs  $F$  is hard:
  - exponential in # attrs!
- Typically, just check if  $X \rightarrow Y$  is in  $F^+$ . Efficient!
  - Compute attribute closure of  $X$  (denoted  $X^+$ ) wrt  $F$ .  
 $X^+ =$  Set of all attributes  $A$  such that  $X \rightarrow A$  is in  $F^+$ 
    - $X^+ := X$
    - Repeat until no change (fixpoint):  
for  $U \rightarrow V \subseteq F$ ,  
if  $U \subseteq X^+$ , then add  $V$  to  $X^+$
  - Check if  $Y$  is in  $X^+$
  - Approach can also be used to check for keys of a relation.
    - If  $X^+ = R$ , then  $X$  is a superkey for  $R$ .
    - Q: How to check if  $X$  is a “candidate key” (minimal)?
    - A: For each attribute  $A$  in  $X$ , check if  $(X-A)^+ = R$

# Attribute Closure (example)

$R = \{A, B, C, D, E\}$

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

- **Is  $B \rightarrow E$  in  $F^+$  ?**

$B^+ = \{B, C, D, E, \dots\}$

... Yep!

- **Is  $D$  a key for  $R$ ?**

$D^+ = \{D, E, C\}$

... Nope!

- **Is  $AD$  a key for  $R$ ?**

$AD^+ = \{A, D, E, C, B\}$

...Yep!

- **Is  $AD$  a *candidate* key for  $R$ ?**

$A^+ = \{A\}$   $D^+ = \{D, E, C\}$

...Yes!

- **Is  $ADE$  a candidate key for  $R$ ?**

No!

# Thanks for that...

- So we know a lot about FDs
- So what?
- Can they help with removing redundancy?

# The Notion of Normal Forms

- Q1: is any refinement is needed??!
- If relation is in a *normal form* (e.g. **BCNF**):
  - we know certain problems are avoided/minimized.
  - helps decide whether decomposing relation is useful.
- Consider a relation R with 3 attributes, ABC.
  - *No (non-trivial) FDs hold:* No redundancy here.
  - *Given  $A \rightarrow B$ :* **If A is not a key**, then several tuples could have the same A value, and if so, they'll all have the same B value!

# Basic Normal Forms

- 1st Normal Form – all attributes atomic
  - I.e. relational model
  - Violated by many common data models
    - Including XML, JSON, various OO models
  - Some of these “non-first-normal form” (NFNF) quite useful in various settings
    - especially in update-never settings like data transmission
    - if you never “unnest”, then who cares!
      - basically relational collection of structured objects
- 1st  $\supset$  2nd (of historical interest)
  - $\supset$  3rd (of historical interest)
  - $\supset$  Boyce-Codd ...

# Boyce-Codd Normal Form (BCNF)

- Reln  $R$  with FDs  $F$  is in BCNF if, for all  $X \rightarrow A$  in  $F^+$ 
  - $A \subseteq X$  (called a trivial FD), or
  - $X$  is a superkey for  $R$ .
- In other words: “ $R$  is in BCNF if the only non-trivial FDs over  $R$  are key constraints.”



# Why is BCNF Useful?

- If R in BCNF, every field of every tuple records useful info that cannot be inferred via FDs.
  - Say we know FD  $X \rightarrow A$  holds for this example relation:
  - Can you guess the value of the missing attribute
  - Yes, so relation is not in BCNF

X	Y	A
x	y1	a
x	y2	?

# Decomposition of a Relation Scheme

- How to normalize a relation?
  - **decompose** into multiple normalized relations
- Suppose  $R$  contains attributes  $A_1 \dots A_n$ .  
A **decomposition** of  $R$  consists of replacing  $R$  by two or more relations such that:
  - Each new relation scheme contains a **subset** of the attributes of  $R$ , and
  - Every attribute of  $R$  appears as an attribute of at least one of the new relations.

# Example (same as before)

Hourly\_Emps

S	N	L	R	W	H
123-22-3666	Attishoo	48	8	10	40
231-31-5368	Smiley	22	8	10	30
131-24-3650	Smethurst	35	5	7	30
434-26-3751	Guldu	35	5	7	32
612-67-4134	Madayan	35	8	10	40

- SNLRWH has FDs  $S \rightarrow \text{SNLRWH}$  and  $R \rightarrow W$
- Q: Is this relation in BCNF?
  - No, The second FD causes a violation;
  - W values repeatedly associated with R values.

# Decomposing a Relation, Part 2

- Easiest fix is to create a relation RW to store these associations, and to remove W from the main schema:

S	N	L	R	H
123-22-3666	Attishoo	48	8	40
231-31-5368	Smiley	22	8	30
131-24-3650	Smethurst	35	5	30
434-26-3751	Guldu	35	5	32
612-67-4134	Madayan	35	8	40

Hourly\_Emps2

R	W
8	10
5	7

Wages

Q: Are both of these relations are now in BCNF?

Yes!  $S \rightarrow \text{SNLRH}$  is OK, as is  $R \rightarrow W$ .

# Problems with Decompositions

- There are three potential problems to consider:
  - 1) May be ***impossible*** to reconstruct the original relation! (Lossiness)
    - Fortunately, not in the SNLRWH example.
  - 2) Dependency checking may require joins.
    - Fortunately, not in the SNLRWH example.
  - 3) Some queries become more expensive.
    - e.g., How much does Guldu earn?
- **Tradeoff**: Must consider these 3 vs. redundancy.

# Lossless Decomposition (example)

S	N	L	R	H
123-22-3666	Attishoo	48	8	40
231-31-5368	Smiley	22	8	30
131-24-3650	Smethurst	35	5	30
434-26-3751	Guldu	35	5	32
612-67-4134	Madayan	35	8	40



R	W
8	10
5	7

Wages

Hourly\_Emps2

=

S	N	L	R	W	H
123-22-3666	Attishoo	48	8	10	40
231-31-5368	Smiley	22	8	10	30
131-24-3650	Smethurst	35	5	7	30
434-26-3751	Guldu	35	5	7	32
612-67-4134	Madayan	35	8	10	40

# Lossy Decomposition (example)

A	B	C
1	2	3
4	5	6
7	2	8



A	B
1	2
4	5
7	2

B	C
2	3
5	6
2	8

$A \rightarrow B$ ;  $C \rightarrow B$

A	B
1	2
4	5
7	2



B	C
2	3
5	6
2	8

=

A	B	C
1	2	3
4	5	6
7	2	8
1	2	8
7	2	3

# Lossless Join Decompositions

- Defn: Decomposition of R into X and Y is **lossless-join** w.r.t. a set of FDs F if, for every instance  $r$  that satisfies F:

$$\pi_X(r) \bowtie \pi_Y(r) = r$$

- It is always true that  $r \subseteq \pi_X(r) \bowtie \pi_Y(r)$ 
  - When the relation is equality, the decomposition is lossless-join.
- Definition easily extended to decomposition into 3 or more relations
- It is essential that all decompositions used to deal with redundancy be lossless!***
- (Avoids Problem #1)



# More on Lossless Decomposition

- Theorem: The decomposition of R into X and Y is **lossless with respect to F** *if and only if* the closure of F contains:

$$X \cap Y \rightarrow X, \text{ or}$$

$$X \cap Y \rightarrow Y$$

- From example: decomposing ABC into AB and BC is lossy, because their intersection (i.e., B) is not a key of either resulting relation.
- Useful corollary: If  $X \rightarrow Z$  holds over R and  $X \cap Z$  is empty then decomposition of R into R-Z and XZ is loss-less (b/c X is a superkey of XZ!)
- Just like our BCNF example!  
Where X is Rating, Z is Wage.  
Clearly Rating intersect Wage is empty.  
So decompose into SNLRH and RW and it is lossless.

# Lossless Decomposition? Yes, but...

A	B	C
1	2	3
4	5	6
7	2	8



A	C
1	3
4	6
7	8

B	C
2	3
5	6
2	8

$A \rightarrow B$ ;  $C \rightarrow B$

A	C
1	3
4	6
7	8



B	C
2	3
5	6
2	8

=

A	B	C
1	2	3
4	5	6
7	2	8

- But, now we can't check  $A \rightarrow B$  without doing a join!

# Dependency Preserving Decomposition

- **Dependency preserving decomposition** (Intuitive):
  - A decomposition where the following is true:
    - If  $R$  is decomposed into  $X$ ,  $Y$  and  $Z$ ,
    - and we enforce FDs individually on each of  $X$ ,  $Y$  and  $Z$ ,
    - then all FDs that held on  $R$  must also hold on result.
    - (Avoids Problem #2 on our list.)
- **Defn: Projection of set of FDs  $F$  :**
  - If  $R$  is decomposed into  $X$  and  $Y$ , the projection of  $F$  on  $X$  (denoted  $F_X$ ) is the set of FDs  $U \rightarrow V$  in  $F^+$ , such that all of the attributes  $U, V$  are in  $X$ .
- *$F^+$ : closure of  $F$ , not just  $F$ !*

## Dependency Preserving Decompositions: Definition

- Defn: Decomposition of R into X and Y is **dependency preserving** if  $(F_X \cup F_Y)^+ = F^+$ 
  - i.e., if we consider only dependencies in the closure  $F^+$  that can be checked in X without considering Y, and in Y without considering X, these imply all dependencies in  $F^+$ .
  - (just the formalism of our intuition above)

# Dependency Preservation: Notes

- Critical to consider  $F^+$  in the definition:
  - ABC,  $A \rightarrow B$ ,  $B \rightarrow C$ ,  $C \rightarrow A$ , decomposed into AB and BC.
  - Is this dependency preserving? Is  $C \rightarrow A$  preserved????
- Well...  $F^+$  contains  $F \cup \{A \rightarrow C, B \rightarrow A, C \rightarrow B\}$ , so...
  - $F_{AB} \supseteq \{A \rightarrow B, B \rightarrow A\}$ ;  $F_{BC} \supseteq \{B \rightarrow C, C \rightarrow B\}$
  - So,  $(F_{AB} \cup F_{BC})^+ \supseteq \{B \rightarrow A, C \rightarrow B\}$
  - Hence  $(F_{AB} \cup F_{BC})^+ \supseteq \{C \rightarrow A\}$

$$(F_X \cup F_Y)^+ = F^+$$

# Decomposition into BCNF

- Consider relation R with FDs F.
- If  $X \rightarrow Y$  violates BCNF, decompose R into R - Y and XY (guaranteed to be loss-less).
  - Repeated application of this idea will give us a collection of relations that are in BCNF
  - Lossless join decomposition, and guaranteed to terminate.
- e.g., CSJDPQV, key C,  $JP \rightarrow C$ ,  $SD \rightarrow P$ ,  $J \rightarrow S$ 
  - {contractid, supplierid, projectid, deptid, partid, qty, value}
  - To deal with  $SD \rightarrow P$ , decompose into SDP, CSJDQV.
  - To deal with  $J \rightarrow S$ , decompose CSJDQV into JS and CJDQV
  - So we end up with: SDP, JS, and CJDQV
- Note: several dependencies may cause violation of BCNF.
- The order in which we “deal with” them could lead to very different sets of relations!

# BCNF and Dependency Preservation

- In general, **there may not be a dependency preserving decomposition into BCNF.**
- E.g., CSZ,  $CS \rightarrow Z$ ,  $Z \rightarrow C$ 
  - Can't decompose while preserving 1st FD; not in BCNF.
- Similarly, decomposition of CSJDPQV into SDP, JS and CJDQV is not dependency preserving (w.r.t. the FDs  **$JP \rightarrow C$** ,  $SD \rightarrow P$  and  $J \rightarrow S$ ).
  - However, it is a lossless join decomposition.
  - In this case, adding JPC to the collection of relations gives us a dependency preserving decomposition.
    - but JPC tuples are stored only for checking the f.d. (**Redundancy!**)

# Summary of Schema Refinement

- BCNF: each field contains data that cannot be inferred via FDs.
  - ensuring BCNF is a good heuristic.
- Not in BCNF? Try decomposing into BCNF relations.
  - Must consider whether all FDs are preserved!



# Summary of Schema Refinement, cont

- What to do when a lossless-join, dependency preserving decomposition into BCNF is impossible?
  - There is a more *permissive* Third Normal Form (3NF)
    - In the hidden slides of slide deck, or book, or Wikipedia
  - But you'll have redundancy. Beware. You will need to keep it from being a problem in your application code.
- Note: even more *restrictive* Normal Forms exist
  - we don't cover them in this course, but some are in the book