## CS 4440 A Emerging Database Technologies

Lecture 3
01/17/24

## Reading Materials

## Database Systems: The Complete Book (2nd edition)

- Chapter 3: Design Theory for Relational Databases (3.13.5)

Supplementary materials
Fundamental of Database Systems (7th Edition)

- Chapter 14 - Basics of Functional Dependencies and


Normalization for Relational Databases

Acknowledgement: The following slides have been adapted from EE477 (Database and Big Data Systems) taught by Steven Whang.

## Design theory for relational databases

- There are many ways to design a relational database schema
- E.g., we just learned how to use an E/R diagram
- It is also common to improve the initial schema (esp. eliminating redundancy)
- Often, the problem is combining too much into one relation
- Fortunately, there is a well-developed design theory for good schema design
- Functional dependencies, normalization, multivalued dependencies
- One of the reasons Databases are powerful and so widely used



## Agenda

Functional dependency
"Anomalies" in relation schemas

- Redundancy
- Update anomaly
- Deletion anomaly
"Normalization" to remove anomalies
- BCNF
- 3NF


## Functional dependency (FD)

- A common constraint on a relation that generalizes the idea of a key
- Definition: if two tuples of $R$ agree on all the attributes $A_{1}, A_{2}, \ldots, A_{n}$, they must also agree on (or functionally determine) $B_{1}, B_{2}, \ldots, B_{m}$
- Denoted as $A_{1} A_{2} \ldots A_{n} \rightarrow B_{1} B_{2} \ldots B_{m}$
- Called "functional" because FD takes $A$ values and produces unique $B$ values

here,


## Functional dependency (FD)

- Consider the following relation, which tries to do "too much" and has redundancies
- Q: What are the FDs?

| title | year | length | genre | studioName | starName |
| :--- | :--- | :--- | :--- | :--- | :--- |
| Ponyo | 2008 | 103 | anime | Ghibli | Yuria Nara |
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| Oldboy | 2003 | 120 | mystery | Show East | Choi Min-Sik |

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- What are the FDs?
title, year $\rightarrow$ length, genre, studioName

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## Functional dependency (FD)

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- What are the FDs?
title, year $\rightarrow$ starName
1

|  |  |  |  |  |  |
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## Functional dependency (FD)

- FD are for all possible instances of a relation
- FDs can be used to decompose relations and eliminate redundancy
- It is common for the right side of an FD to be a single attribute
- In fact, $A_{1} A_{2} \ldots A_{n} \rightarrow B_{1} B_{2} \ldots B_{m}$ is equivalent to the set of FD's

$$
\begin{aligned}
& A_{1} A_{2} \ldots A_{n} \rightarrow B_{1} \\
& A_{1} A_{2} \ldots A_{n} \rightarrow B_{2} \\
& \ldots \\
& A_{1} A_{2} \ldots A_{n} \rightarrow B_{m}
\end{aligned}
$$

## Key

- A set of attributes that functionally determine all other attributes
- And no proper subset does the same (i.e., a key is minimal)
- There can be multiple keys (there is no special role of the primary key here)
\{title, year, starName\} is a key
\{title, year\} is not a key because title year $\rightarrow$ starName is not an FD
\{year, starName\} is not a key because year starName $\rightarrow$ title is not an FD
\{title, starName\} is not a key because title starName $\rightarrow$ year is not an FD

| title | year | length | genre | studioName | starName |
| :--- | :--- | :--- | :--- | :--- | :--- |
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## Superkey

- A set of attributes that contains a key
- Not necessarily minimal
\{title, year, starName\} is a key or superkey
\{title, year, length, starName\} is a superkey

| title | year | length | genre | studioName | starName |
| :--- | :--- | :--- | :--- | :--- | :--- |
| Ponyo | 2008 | 103 | anime | Ghibli | Yuria Nara |
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## Reasoning about FDs

- Suppose we are told of a set of FDs that a relation satisfies
- Often we can deduce that relation must satisfy certain other FDs
- Example: if a relation $R(A, B, C)$ satisfies the FD's $A \rightarrow B$ and $B \rightarrow C, R$ also satisfies $A \rightarrow C$
- Proof: given two tuples $\left(a, b_{1}, c_{1}\right),\left(a, b_{2}, c_{2}\right)$, we know that $b_{1}=b_{2}$ and, therefore, $c_{1}=c_{2}$ as well
- This ability to discover additional FDs is helpful for good relation schema design


## Splitting/combining rule

- Splitting/combining can be applied to the right sides of FD's



## Splitting/combining rule

- For example,
title year $\rightarrow$ length genre studioName ||
title year $\rightarrow$ length
title year $\rightarrow$ genre
title year $\rightarrow$ studioName


## Splitting rule

- Splitting rule does not apply to the left sides of FD's
title year $\rightarrow$ length
title $\rightarrow$ length
year $\rightarrow$ length


## Trivial functional dependencies

- A constraint is trivial if it holds for every possible instance of the relation
- A trivial FD $A_{1} A_{2} \ldots A_{n} \rightarrow B_{1} B_{2} \ldots B_{m}$ is where $\left\{B_{1}, B_{2}, \ldots B_{m}\right\} \subseteq\left\{A_{1}, A_{2}, \ldots, A_{n}\right\}$
- E.g., title year $\rightarrow$ title
- E.g., title $\rightarrow$ title
- Trivial dependency rule: $A_{1} A_{2} \ldots A_{n} \rightarrow B_{1} B_{2} \ldots B_{m}$ is equivalent to $A_{1} A_{2} \ldots A_{n} \rightarrow C_{1} C_{2} \ldots C_{k}$ where the C's are the B's that are not also A's
- E.g., title year $\rightarrow$ title length is equivalent to title year $\rightarrow$ length


## Closure of attributes

- The closure of $\left\{A_{1}, A_{2}, \ldots, A_{n}\right\}$ under the FD's in $S$ is the set of attributes $X$ where $A_{1} A_{2} \ldots A_{n} \rightarrow X$ follows from the FD's of $S$
- Denoted as $\left\{A_{1}, A_{2}, \ldots, A_{n}\right\}+$

$$
\begin{aligned}
& \mathrm{AB} \rightarrow \mathrm{C} \\
& \mathrm{BC} \rightarrow \mathrm{AD} \\
& \mathrm{D} \rightarrow \mathrm{E} \\
& \mathrm{CF} \rightarrow \mathrm{~B}
\end{aligned}
$$

$\{A, B\}+$
A, B

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$\{A, B\}+$
A, B, C

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$\{A, B\}+$
A, B, C, D

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\end{aligned}
$$

$\{A, B\}+$
A, B, C, D, E
Cannot be expanded further, so this is a closure

## Closure algorithm

- Input: $\left\{A_{1}, A_{2}, \ldots, A_{n}\right\}$ and a set of FD's $S$
- Output: the closure $\left\{A_{1}, A_{2}, \ldots, A_{n}\right\}+$

1. If necessary, split the FD's of $S$ so each $F D$ has a single attribute on the right
2. Initialize $X=\left\{A_{1}, A_{2}, \ldots, A_{n}\right\}$
3. Repeatedly search an $F D B_{1} B_{2} \ldots B_{m} \rightarrow C$ where the B 's are in X , but C is not, and add C to X
4. Return X

Proof of correctness in textbook


## Why computing closure?

- Test if $F D A_{1} A_{2} \ldots A_{n} \rightarrow B$ follows from a set of FDs $S$
- Compute $\left\{\mathrm{A}_{1}, \mathrm{~A}_{2}, \ldots, \mathrm{~A}_{\mathrm{n}}\right\}+$ and checking if it contains B
- In the previous closure example, $\mathrm{AB} \rightarrow \mathrm{D}$ follows from the FD 's because $\{\mathrm{A}, \mathrm{B}\}+=\{\mathrm{A}$, B, C, D, E\}


## Closures and keys

- $A_{1}, A_{2}, \ldots, A_{n}$ is a superkey if and only if $\left\{A_{1}, A_{2}, \ldots, A_{n}\right\}+$ is the set of all attributes


## Armstrong's axioms

You can derive any FDs that follows from a given set using these axioms:

1. Reflexivity: If $\left\{B_{1}, B_{2}, \ldots, B_{m}\right\} \subseteq\left\{A_{1}, A_{2}, \ldots, A_{n}\right\}$ then $A_{1} A_{2} \ldots A_{n} \rightarrow B_{1} B_{2} \ldots B_{m}$
2. Augmentation: If $A_{1} A_{2} \ldots A_{n} \rightarrow B_{1} B_{2} \ldots B_{m}$ then $A_{1} A_{2} \ldots A_{n} C_{1} C_{2} \ldots C_{k} \rightarrow B_{1} B_{2} \ldots B_{m} C_{1} C_{2} \ldots C_{k}$ (remove any duplicates on left and right hand sides)
3. Transitivity: If $A_{1} A_{2} \ldots A_{n} \rightarrow B_{1} B_{2} \ldots B_{m}$ and $B_{1} B_{2} \ldots B_{m} \rightarrow C_{1} C_{2} \ldots C_{k}$ then $A_{1} A_{2} \ldots A_{n} \rightarrow C_{1} C_{2} \ldots C_{k}$

These three inference rules are sound and complete

- Sound: only produces FDs in the closure
- Complete: produces all the FDs in the closure


## Armstrong's axioms

- Does $\mathrm{AB} \rightarrow \mathrm{D}$ follow from the FDs below?

$$
\begin{aligned}
& \mathrm{AB} \rightarrow \mathrm{C} \\
& \mathrm{BC} \rightarrow \mathrm{AD} \\
& \mathrm{D} \rightarrow \mathrm{E} \\
& \mathrm{CF} \rightarrow \mathrm{~B}
\end{aligned}
$$

1. $\mathrm{AB} \rightarrow \mathrm{C}$ (given)
2. $B C \rightarrow A D$ (given)

## Armstrong's axioms

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\end{aligned}
$$

1. $\mathrm{AB} \rightarrow \mathrm{C}$ (given)
2. $\mathrm{BC} \rightarrow \mathrm{AD}$ (given)
3. $\mathrm{AB} \rightarrow \mathrm{BC}$ (Augmentation on 1)

## Armstrong's axioms

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2. $B C \rightarrow A D$ (given)
3. $\mathrm{AB} \rightarrow \mathrm{BC}$ (Augmentation on 1)
4. $\mathrm{AB} \rightarrow \mathrm{AD}$ (Transitivity on 2,3 )

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3. $A B \rightarrow B C$ (Augmentation on 1)
4. $\mathrm{AB} \rightarrow \mathrm{AD}$ (Transitivity on 2,3 )
5. $A D \rightarrow D$ (Reflexivity)

## Armstrong's axioms

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1. $A B \rightarrow C$ (given)
2. $B C \rightarrow A D$ (given)
3. $A B \rightarrow B C$ (Augmentation on 1)
4. $\mathrm{AB} \rightarrow \mathrm{AD}$ (Transitivity on 2,3 )
5. $\mathrm{AD} \rightarrow \mathrm{D}$ (Reflexivity)
6. $\mathrm{AB} \rightarrow \mathrm{D}$ (Transitivity on 4,5 )

## Exercise \#1

- Given R(A, B, C, D) and FD's $\mathrm{AB} \rightarrow \mathrm{C}, \mathrm{C} \rightarrow \mathrm{D}, \mathrm{D} \rightarrow \mathrm{A}$
- Can you show that $A B$ is a key of $R$ ?
- Can you show that $B D$ is a key of $R$ ?


## Minimal basis

- Sometimes we want to choose which FD's represent the full set of FD's of a relation
- E.g., when computing keys
- Given a set of FD's $S$, any set of FD's equivalent to $S$ is a basis for $S$
- A minimal basis of $S$ is a basis $M$ such that
- All the FD's in M have singleton right sides
- If any FD is removed, M is no longer a basis
- If for any FD in $M$ we remove one or more attributes from the left side, $M$ is no longer a basis
- Suppose $\mathrm{S}=\{\mathrm{A} \rightarrow \mathrm{AB}, \mathrm{AB} \rightarrow \mathrm{C}\}$
- Then the minimal basis is $\{A \rightarrow B, A \rightarrow C\}$
- In general, there can be multiple minimal bases


## Minimal basis generation

Input: $\mathrm{S}=\{\mathrm{A} \rightarrow \mathrm{AB}, \mathrm{AB} \rightarrow \mathrm{C}\}$

1. Split FD's so that they have singleton right sides

$$
\mathrm{M}=\{\mathrm{A} \rightarrow \mathrm{~B}, \mathrm{~A} \rightarrow \mathrm{~A}, \mathrm{AB} \rightarrow \mathrm{C}\}
$$

2. Remove trivial FDs
$M=\{A \rightarrow B, A B \rightarrow C\}$
3. Minimize the left sides of each FD
$M=\{A \rightarrow B, A \rightarrow C\}$
4. Remove redundant FDs

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

## Projection of functional dependencies

- When designing a schema, sometimes need to answer the following question: Given a relation $R$ with a set of FD's $S$, what FD's hold for $R_{1}=\pi_{L}(R)$ ?
- Compute all the FD's that
- follow from S and
- involve only attributes in $R_{1}$
- Example
- Suppose $R(A, B, C, D)$ has FD's $A \rightarrow B, B \rightarrow C, C \rightarrow D$
- Then the FD's for $R_{1}(A, C, D)$ are $A \rightarrow C, C \rightarrow D$
title, year $\rightarrow$ length, genre, studioName


## Recap

- Design theory
- Functional dependency (FD)
- Trivial FDs
- Splitting/combining rule

|  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- |
| title | year | length | genre | studioName | starName |
| Ponyo | 2008 | 103 | anime | Ghibli | Yuria Nara |
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- Closure of attributes
- Armstrong's axioms
- Minimal basis
- Projection of FDs

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$$

1. $\mathrm{AB} \rightarrow \mathrm{C}$ (given)
2. $B C \rightarrow A D$ (given)
3. $\mathrm{AB} \rightarrow \mathrm{BC}$ (Augmentation on 1)
4. $\mathrm{AB} \rightarrow \mathrm{AD}$ (Transitivity on 2,3 )
5. $\mathrm{AD} \rightarrow \mathrm{D}$ (Reflexivity)

## Design of relational database schemas

- Careless schema selection may lead to redundancies and anomalies
- We will discuss
- Redundancy and related anomalies
- Relation decomposition
- Boyce-Codd normal form (BCNF)
- 3NF


## Anomalies

- Occurs when we try to cram too much information into a single relation

1. Redundancy: information is repeated unnecessarily
2. Update anomaly: only updating the first tuple may
leave the second tuple incorrect

Movies 1

| title | year | length | genre | studioName | starName |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Ponyo | 2008 | 103 | anime | Ghibli | Yuria Nara |
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3. Deletion anomaly: removing the movie star Choi Min-Sik will also remove the movie information of Oldboy

## Decomposing relations

- The accepted way to eliminate anomalies is to decompose relations
Movies2 No redundancy or update anomalies

| title | year | length | genre | studioName |
| :--- | :--- | :--- | :--- | :--- |
| Ponyo | 2008 | 103 | anime | Ghibli |
| Oldboy | 2003 | 120 | mystery | Show East |

Movies3 No deletion anomalies

| title | year | starName |
| :--- | :--- | :--- |
| Ponyo | 2008 | Yuria Nara |
| Ponyo | 2008 | Hiroki Doi |
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## Decomposing relations

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Movies2

| title | year | length | genre | studioName |
| :--- | :--- | :--- | :--- | :--- |
| Ponyo | 2008 | 103 | anime | Ghibli |
| Oldboy | 2003 | 120 | mystery | Show East |

Movies3

| title | year | starName |
| :--- | :--- | :--- |
| Ponyo | 2008 | Yuria Nara |
| Ponyo | 2008 | Hiroki Doi |
| Oldboy | 2003 | Choi Min-Sik |

This is OK because title and year form a key of a movie and cannot be more succinct; if one of the year changes, the movie is a different one

