## Database

## Normalization

Immanuel Trummer itrummer@cornell.edu www.itrummer.org

## Database Design Process

- Requirement analysis
- Based on use cases, business process descriptions
- Conceptual design
- Model what the DB is about, e.g. via ER diagrams
- Schema normalization
- E.g., reduce data redundancy via transformation
- Physical tuning
- E.g., decide which indices to create or sort order


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## Schema Normalization

- Can prepare first sketch of database schema via ER
- Resulting schema will most likely be sub-optimal
- I.e., the schema implies lots of data redundancy
- Data redundancy leads to various problems
- Optimize initial schema via schema normalization


## Roadmap

- Functional dependencies: indicate redundancy
- Normal forms: desirable formal schema properties
- Normalization algorithms: transform to normal form


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- Functional dependencies: indicate redundancy
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## Functional Dependency (FD)

- Used to detect data redundancies (want to remove)
- Values in some columns uniquely decide values in others
- Notation: $X \rightarrow Y$ means values in $X$ decide values in $Y$


## Example Dependencies

| TA Name | Hours | Salary |
| :---: | :---: | :---: |
| John | Full Time | 1,000 |
| Mike | Part Time | 500 |
| Anna | Part Time | 500 |
| Lisa | Full Time | 1,000 |

Hours $\rightarrow$ Salary

## Example Dependencies



Hours $\rightarrow$ Salary

## Problems

- Update anomaly: could make TA salaries inconsistent
- Insertion anomaly: could lack salary info for new hours
- Deletion anomaly: could lose salary info after deletions


## Example Solution

| TA Name | Hours |
| :---: | :---: |
| John | Full Time |
| Mike | Part Time |
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| Hours | Salary |
| :---: | :---: |
| Full Time | 1,000 |
| Part Time | 500 |

Hours $\rightarrow$ Salary

## Solution Analysis

- We removed redundancy by decomposing table
- FD does not connect columns in same table
- Prior anomalies cannot happen anymore
- Must avoid data loss via decomposition
- Can reconstruct based on FD (Hours $\rightarrow$ Salary)
- Recompose by looking up Salary for Hours value
- Decomposing table may require additional joins!


## Functional Dependencies and Redundancy

- FDs state that values in X determine values in Y
- Redundant storage of Y if X stored multiple times
- Sufficient to store Y once for each X value
- Want to design schema to avoid this in each case
- Considering all possible future database states
- Want to avoid storing $X$ and $Y$ in same table, except ...


## When To Allow All FD Columns in Same Table?

## Finding FDs

- Common mistake: try finding FDs by looking at data
- Data only captures current state of the database
- Not all functional dependencies may appear
- Data may suggest misleading "pseudo FDs"
- Two valid sources for mining FDs:
- Domain knowledge
- Inferring new FDs from given FDs


## Inferring FDs

- Notation F1 |= F2 means FDs F1 imply FDs F2
- No relation can satisfy F1 without satisfying F2
- Can infer all FDs by applying Armstrong's Axioms:
- Reflexivity: if $Y \subseteq X$ then $X \rightarrow Y$ is implied
- Augmentation: if $X \rightarrow Y$ then $X Z \rightarrow Y Z$ for any $Z$
- Transitivity: if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$


## FD Closure

- Closure of a set of FDs are all implied FDs
- $F+=\{f|F|=f\}$
- Can be calculated using Armstrong's axioms
- $F$ is a cover for $G$ if $F+=G+$
- The closure can be extremely large


## Example: Inferring FDs

- $F=\{$
\{Course\} $\rightarrow$ \{Lecturer\},
\{Course\} $\rightarrow$ \{Department\},
\{Lecturer, Department\} $\rightarrow$ \{Office $\}$
\}
- FDs inferred from F:
- \{Course, Department\} $\rightarrow$ \{Department\}
- \{Course, Lecturer\} $\rightarrow$ \{Department, Lecturer\}
- \{Course\} $\rightarrow$ \{Office $\}$


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## Details on Inference

1. $\{$ Course $\} \rightarrow\{$ Lecturer $\}$
2. \{Course\} $\rightarrow$ \{Department\}
3. \{Lecturer, Department $\} \rightarrow$ \{Office $\}$

Given
4. $\{$ Course $\} \rightarrow$ \{Course, Lecturer\}

Inferred
5. \{Course, Lecturer\} $\rightarrow$ \{Lecturer, Department $\}$
6. \{Course\} $\rightarrow$ \{Lecturer, Department $\}$
7. $\{$ Course $\} \rightarrow\{$ Office $\}$

## Attribute Closure

- Entire closure is typically too large to be useful
- Attribute closure gets all FDs for fixed left attributes
- $\mathrm{X}+$ for attributes X is attribute closure
- Useful for checking if one specific FD is implied


## Finding Attribute Closures

- Goal: get attribute closure of $X$ given FDs $F$
- Repeat until no changes
- Start with closure X
- Iterate over all FDs $A \rightarrow B$ in $F$
- If closure $\subseteq A$ then add $B$ to closure


## Example: Attribute Closures

- $\mathrm{F}=\{\mathrm{A} \rightarrow \mathrm{D}, \mathrm{AB} \rightarrow \mathrm{E}, \mathrm{BI} \rightarrow \mathrm{E}, \mathrm{CD} \rightarrow \mathrm{I}, \mathrm{E} \rightarrow \mathrm{C}\}$
- Want to find attribute closure (AE)+
- Before Iteration 1: closure is (AE)
- Before Iteration 2: closure is (ACDE)
- Before Iteration 3: closure is (ACDEI)
- (No change in Iteration 3)


# Attribute Closure Complexity 

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O(Nr. FDs) Iterations

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O(Nr. Attributes)

## Complexity in O(Nr. FDs² * Nr. Attributes)

Slides by Immanuel Trummer, Cornell University

## Finding All Relation Keys

- Iterate over all attribute sets $A$
- Check if $A$ is a key:
- Calculate attribute closure (A)+
- It's a key if $(A)+$ includes all attributes


## Roadmap

- Functional dependencies: indicate redundancy
- Normal forms: desirable formal schema properties
- Normalization algorithms: transform to normal form


## Boyce-Codd Normal Form (BCNF)

- A schema if in BCNF if the following conditions holds
- For all FDs $A \rightarrow b$ whose attributes are in same table
- Either b is element in A ("trivial" FD)
- Or A contains a key of its associated table
- This must apply to given and inferred FDs!

Does not permit any redundancy!

## BCNF Example

- For all FDs $\mathrm{A} \rightarrow \mathrm{b}$ with attributes in same table
- Either $b$ is element in $A($ "trivial" FD)
- Or A contains a key of its associated table
- Is this schema in BCNF?
- Schema: table ${ }_{1}(\mathrm{a}, \mathrm{b})$, table $_{2}(\mathrm{a}, \mathrm{d}, \mathrm{e})$, table $_{3}(\mathrm{c}, \mathrm{d})$
- (Initial) FDs: $\{\mathrm{a} \rightarrow \mathrm{b}, \mathrm{bc} \rightarrow \mathrm{d}, \mathrm{a} \rightarrow \mathrm{c}, \mathrm{d} \rightarrow \mathrm{ae}\}$


## Third Normal Form (3NF)

- A schema if in 3NF if the following conditions holds
- For all FDs $A \rightarrow b$ whose attributes are in same table
- Either b is element in A ("trivial" FD)
- Or A contains a key of its associated table
- Or b is part of some minimal key
- This must apply to given and inferred FDs!


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Allows Some Redundancy

- This must apply to given and inferred FDs!


## 3NF Example

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- Schema: table $1(a, b)$, table $_{2}(a, d, e)$, table $_{3}(c, d)$
- (Initial) FDs: $\{\mathrm{a} \rightarrow \mathrm{b}, \mathrm{bc} \rightarrow \mathrm{d}, \mathrm{a} \rightarrow \mathrm{c}, \mathrm{d} \rightarrow \mathrm{ae}\}$


# Comparison of Normal Forms 

- BCNF disallows any redundancy
- Pro: avoids all negative effects of redundancy
- Con: may require breaking up dependencies
- 3NF allows redundancy in some cases
- Pro: can always preserve dependencies
- Con: may still have some negative effects


# Comparison of Normal Forms 

- BCNF disallows any redundancy
- Pro: avoids all negative effects of redundancy
- Con: may require breaking up dependencies
- 3NF allows redundancy in some cases
I.e., verifying FDs
may require joins
- Pro: can always preserve dependencies
- Con: may still have some negative effects


## Roadmap

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## Decomposition

- Normal forms impose conditions on FDs in single table
- Decompose tables into smaller tables to satisfy them
- Decomposition must allow to reconstruct original data
- Assume we decomposed R into X and Y
- We can do so if $\mathbf{X} \cap \mathbf{Y} \rightarrow \mathbf{X}$ or $\mathbf{X} \cap \mathbf{Y} \rightarrow \mathbf{Y}$ is an FD
- Can then match each row from Y to one row from $\mathrm{X} /$ Can then match each row from $X$ to one row from $Y$


## Lossless Decomposition

| TA <br> Name | Hours | Office |
| :---: | :---: | :---: |
| John | Full <br> Time | 401 b |
| Mike | Part <br> Time | 205 |
| Anna | Part <br> Time | 310 |
| Lisa | Full <br> Time | 112 |


| Hours | Salary |
| :---: | :---: |
| Full Time | 1,000 |
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## Towards BCNF

- Repeat while some FD $A \rightarrow b$ on $R$ violates $B C N F$ rules
- Decompose R into R-b and Ab
- All decompositions are lossless as (R-b) $\cap A b=A \rightarrow b$
- Will terminate as tables get smaller and smaller
- End result may depend on decomposition order


## BCNF Example

- CSJDPQV, key $C, J P \rightarrow C, S D \rightarrow P, J \rightarrow S$
- Bring this into BCNF!


## BCNF (One) Solution

- CSJDPQV, key $C, J P \rightarrow C, S D \rightarrow P, J \rightarrow S$
- For SD $\rightarrow$ P, decompose into SDP, CSJDQV
- For J $\rightarrow$ S, decomposes CSJDQV into JS, CJDQV
- Final database schema: SDP, JS, CJDQV


## Dependency Preservation

- Assume we decompose $R$ into $X$ and $Y$
- Assume we enforce FDs on X and Y separately
- I.e., we enforce all FDs that only use attributes on $X$
- Then we enforce all FDs that only use attributes on $Y$
- This enforces all FDs on R if dependency preserving


## Decomposition Properties

- Reminder: lossless vs. dependency preserving
- None of the two properties implies the other!
- BCNF may lose dependency preservation
- 3NF fixes that


## Towards 3NF

- Same procedure as for BCNF with one extension
- If dependency $A \rightarrow b$ broken then add relation $A b$
- Want to use minimal cover FDs for this!
- Right hand side of each FD is a single attribute
- Closure changes when deleting any FD
- Closure changes when deleting any attribute


## DB Design Example

## Draw ER diagram

- We design the database for a Web shop, described below
- Accounts have a (unique) name, a password, and a timestamp of the last login.
- Customers own at most one account, they have a customer ID (unique), a name, and one or multiple addresses.
- Each address has an address ID, a street name and number, and an associated country.
- Employees have an employee ID (unique), a name, one primary address, and at least one assigned account to supervise. They are associated with a job title, the number of hours worked weekly, and salary.



# Translate into Schema! 

## DB Schema - First Draft

- CustomerWaccount(Cid,CName,Aname, Timestamp,Password)
- Employee(EmpID,Name,Job,Hours,Salary,AID)
- Supervises(EmpID,Cid)
- Address(AID,StreetN,StreetNr,Country)
- CustomerHasAddress(Cid,AID)


## Bring to BCNF

## Normalized Schema

- Functional dependencies:
- Key and trivial constraints (allowed by BCNF)
- Job, Hours $\rightarrow$ Salary (needs to be resolved!)
- Decompose Employee table:
- From Employee(EmpID,Name,Job,Hours,Salary,AID)
- Into Employee(EmpID,Name,Job,Hours,AID), JobHoursToSalary(Job, Hours,Salary)

