

COSI 127b

Introduction to Database Systems

Lecture 11: E/R (cont), Theoretical DB Design

What a DBMS Manages

1. Data Organization

- Logical: Relational Data Model, Database Design Techniques

2. Data Retrieval

- Logical: Query Languages: RA, TRC, SQL

3. Data Integrity

- Logical: Transactions, Integrity Constraints

Review: Good DB Design

Three Approaches:

1. Ad hoc:

- use **Entity-Relationship Model** to model data requirements
- translate **ER** design into relational schema

Issue: How to tell if design is "good"?

2. Theoretical:

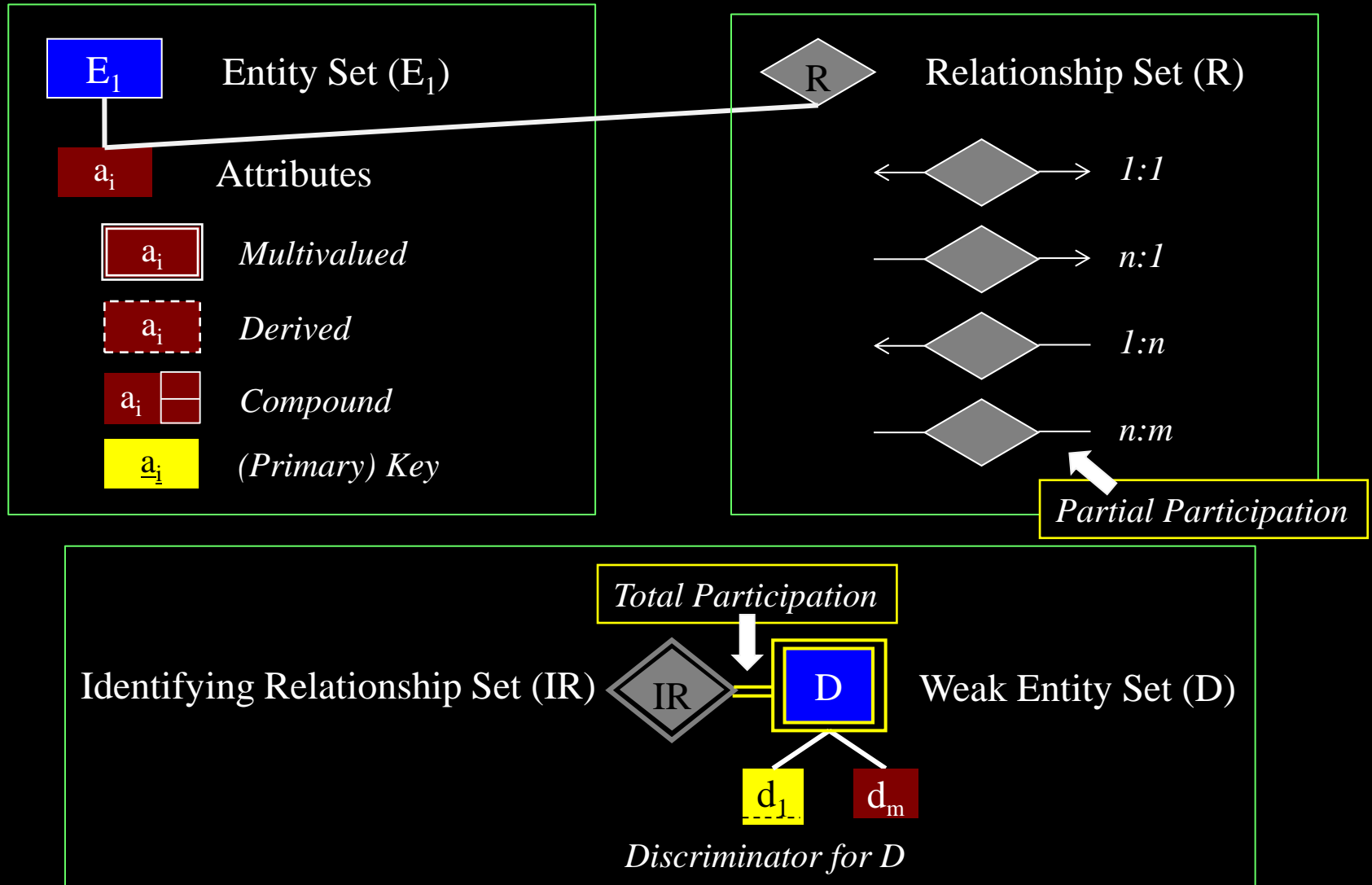
- construct **universal relations** (e.g., Borrower-All)
- **decompose** above using known functional dependencies

Issue: Time-Consuming and Complex

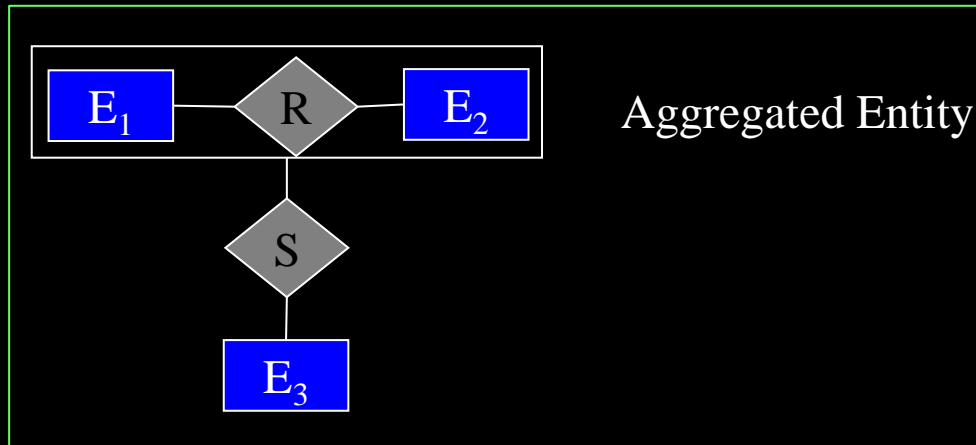
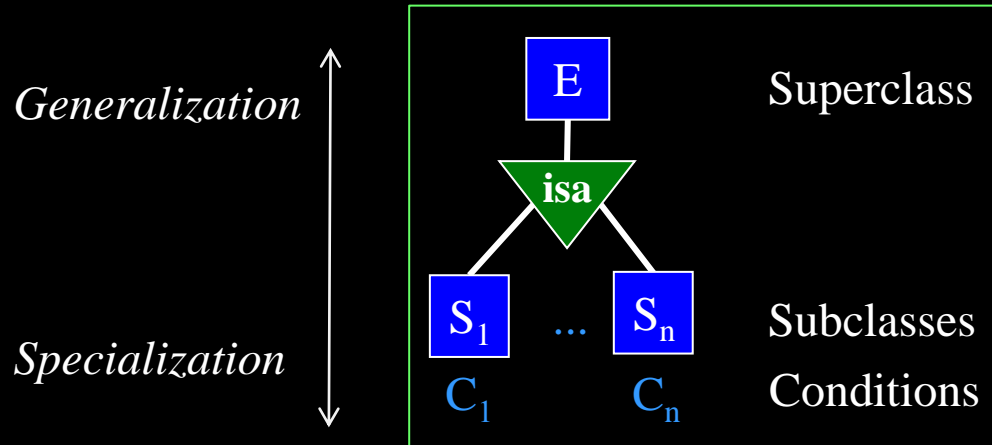
3. Practical:

- use ER Model to produce 1st cut DB design
- use FDs to refine and verify

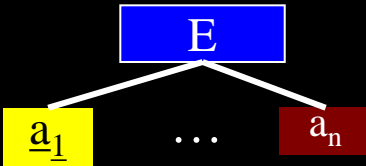
Review: E/R Cheat Sheet



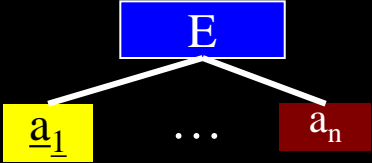
Review: E/R Cheat Sheet



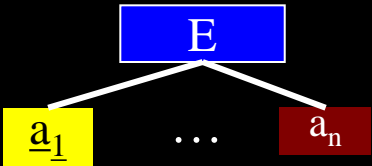
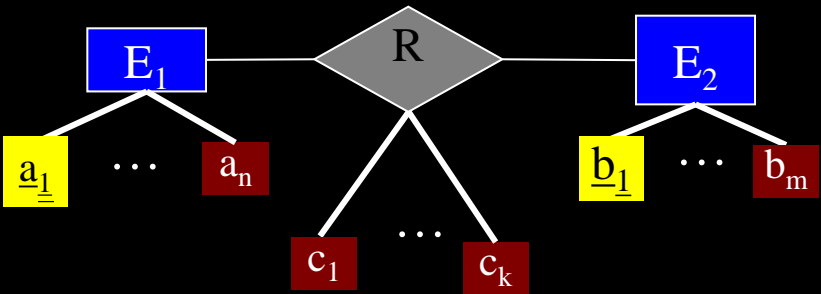
E/R Diagrams and Relations

E/R	Relational Schema
<p data-bbox="112 406 347 456">Entity Sets</p>  <pre data-bbox="357 421 724 585">graph TD; E[E] --- a1[a1]; E --- an[an];</pre>	

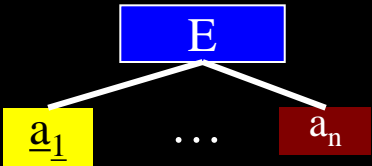
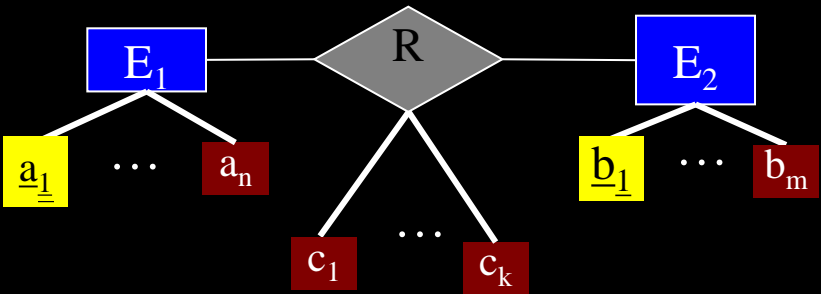
E/R Diagrams and Relations

E/R	Relational Schema
<p data-bbox="112 408 349 458">Entity Sets</p>  <pre data-bbox="357 425 730 586">graph TD; E[E] --- a1[a1]; E --- an[an];</pre>	$E = (\underline{a_1}, \dots, a_n)$

E/R Diagrams and Relations

E/R	Relational Schema
<p>Entity Sets</p> 	$E = (\underline{a_1}, \dots, a_n)$
<p>Relationship Sets</p> 	

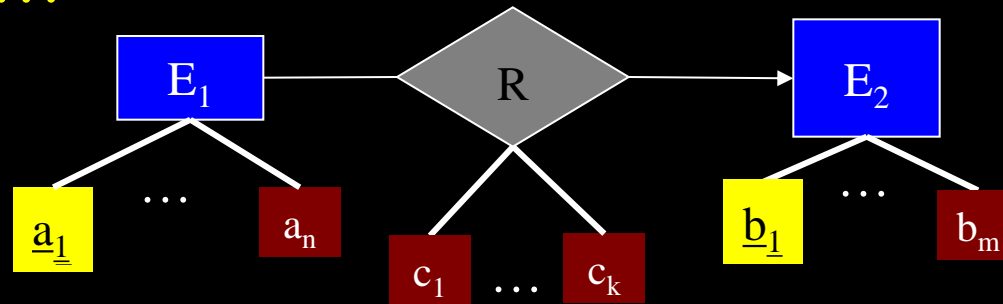
E/R Diagrams and Relations

E/R	Relational Schema
<p>Entity Sets</p> 	$E = (\underline{a_1}, \dots, a_n)$
<p>Relationship Sets</p> 	$R = (\underline{a_1}, \underline{b_1}, c_1, \dots, c_n)$ <p> a_1: E_1's key b_1: E_2's key c_1, \dots, c_k: attributes of R </p>

Not the whole story for Relationship Sets ...

E/R Diagrams and Relations

What about...



Could have: $R = (\underline{a_1}, \underline{b_1}, c_1, \dots, c_k)$ but...

- a_1 is a key for $E_1 = (\underline{a_1}, \dots, a_n)$
- a_1 is also a key for R

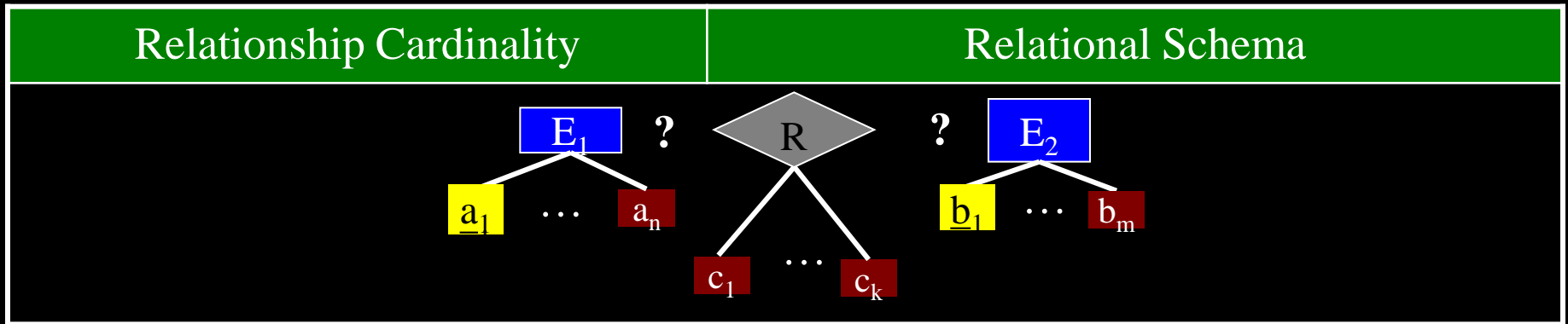
Rule of Thumb

*Fewer tables good,
as long as no
redundancy*

Instead:

- Ignore R
- Add b_1, c_1, \dots, c_k to E_1 instead (i.e: $E_1 = (\underline{a_1}, \dots, a_n, b_1, c_1, \dots, c_k)$)

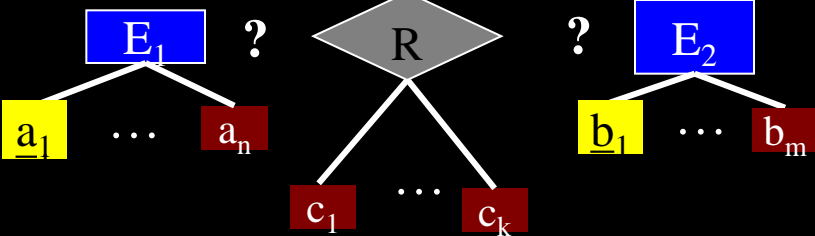

E/R Diagrams and Relations



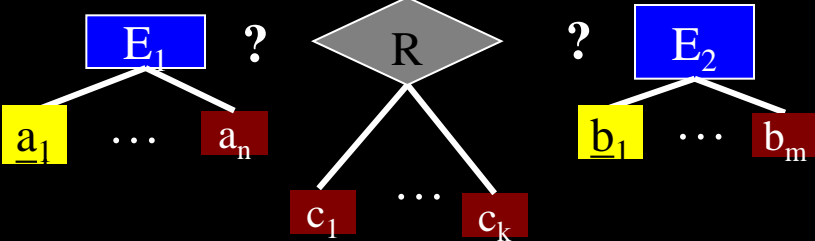


E/R Diagrams and Relations

Relationship Cardinality	Relational Schema
<p>n:m</p>	

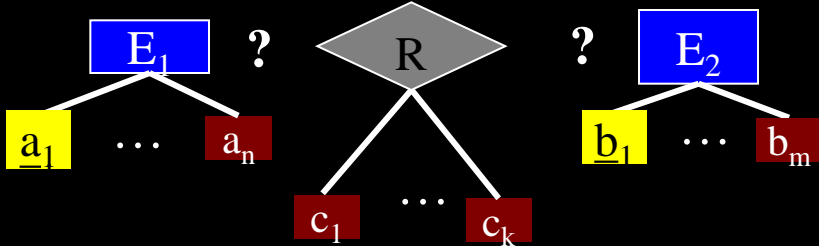


E/R Diagrams and Relations

Relationship Cardinality	Relational Schema
	
$n:m$ 	$E_1 = (\underline{a_1}, \dots, a_n)$ $E_2 = (\underline{b_1}, \dots, b_m)$ $R = (\underline{a_1}, \underline{b_1}, c_1, \dots, c_k)$

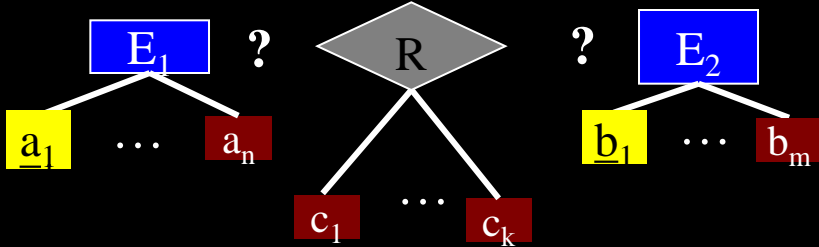



E/R Diagrams and Relations

Relationship Cardinality	Relational Schema
	
<p>n:m</p> 	$E_1 = (\underline{a_1}, \dots, a_n)$ $E_2 = (\underline{b_1}, \dots, b_m)$ $R = (\underline{a_1}, \underline{b_1}, c_1, \dots, c_k)$
<p>n:1</p> 	

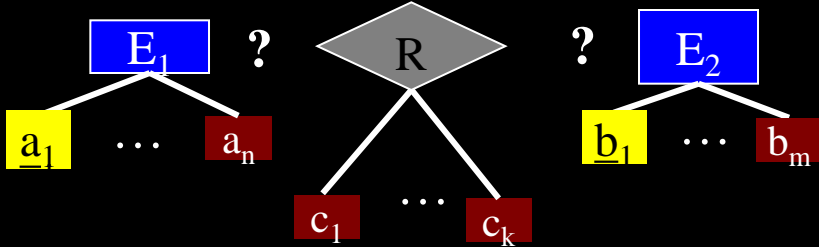



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Relationship Cardinality	Relational Schema
	
$n:m$ 	$E_1 = (\underline{a_1}, \dots, a_n)$ $E_2 = (\underline{b_1}, \dots, b_m)$ $R = (\underline{a_1}, \underline{b_1}, c_1, \dots, c_k)$
$n:1$ 	$E_1 = (\underline{a_1}, \dots, a_n, b_1, c_1, \dots, c_k)$ $E_2 = (\underline{b_1}, \dots, b_m)$

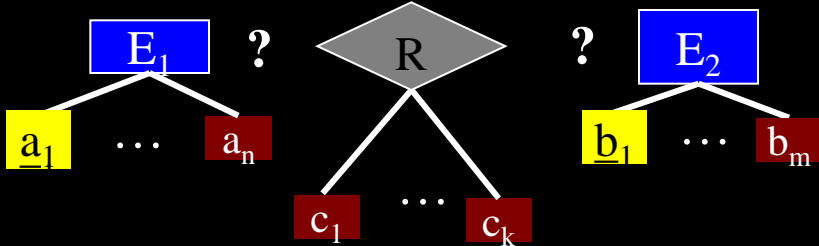




E/R Diagrams and Relations

Relationship Cardinality	Relational Schema
	
$n:m$ 	$E_1 = (\underline{a_1}, \dots, a_n)$ $E_2 = (\underline{b_1}, \dots, b_m)$ $R = (\underline{a_1}, \underline{b_1}, c_1, \dots, c_k)$
$n:1$ 	$E_1 = (\underline{a_1}, \dots, a_n, b_1, c_1, \dots, c_k)$ $E_2 = (\underline{b_1}, \dots, b_m)$
$1:n$ 	

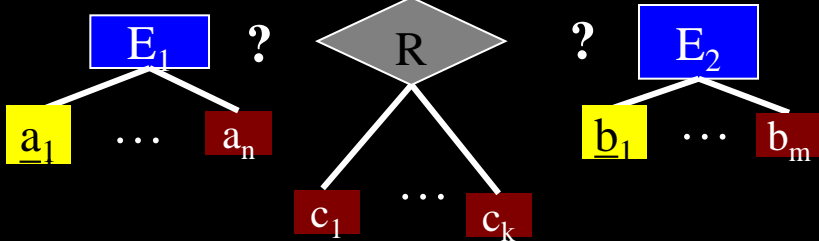




E/R Diagrams and Relations

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$n:m$ 	$E_1 = (\underline{a_1}, \dots, a_n)$ $E_2 = (\underline{b_1}, \dots, b_m)$ $R = (\underline{a_1}, \underline{b_1}, c_1, \dots, c_k)$
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$1:1$ 	

E/R Diagrams and Relations

Relationship Cardinality	Relational Schema
	
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$n:1$ 	$E_1 = (\underline{a_1}, \dots, a_n, b_1, c_1, \dots, c_k)$ $E_2 = (\underline{b_1}, \dots, b_m)$
$1:n$ 	$E_1 = (\underline{a_1}, \dots, a_n)$ $E_2 = (\underline{b_1}, \dots, b_m, a_1, c_1, \dots, c_k)$
$1:1$ 	<p>Treat as $n:1$ or $1:n$</p>

Exercise: Draw the ER diagram for...

5

Account		
<u>bname</u>	<u>acct no</u>	balance
Downtown	A-101	500
Mianus	A-215	700
Perry	A-102	400
R.H.	A-305	350
Brighton	A-201	900
Redwood	A-222	700
Brighton	A-217	750

6

Depositor	
<u>cname</u>	<u>acct_no</u>
Johnson	A-101
Smith	A-215
Hayes	A-102
Turner	A-305
Johnson	A-201
Jones	A-217
Lindsay	A-222

1

Customer		
<u>cname</u>	<u>cstreet</u>	<u>ccity</u>
Jones	Main	Harrison
Smith	North	Rye
Hayes	Main	Harrison
Curry	North	Rye
Lindsay	Park	Pittsfield
Turner	Putnam	Stanford
Williams	Nassau	Princeton
Adams	Spring	Pittsfield
Johnson	Alma	Palo Alto
Glenn	Sand Hill	Woodside
Brooks	Senator	Brooklyn
Green	Walnut	Stanford

2

Branch		
<u>bname</u>	<u>bcity</u>	assets
Downtown	Brooklyn	9M
Redwood	Palo Alto	2.1M
Perry	Horseneck	1.7M
Mianus	Horseneck	0.4M
R.H.	Horseneck	8M
Pownel	Bennington	0.3M
N. Town	Rye	3.7M
Brighton	Brooklyn	7.1M

4

Borrower	
<u>cname</u>	<u>lno</u>
Jones	L-17
Smith	L-23
Hayes	L-15
Jackson	L-14
Curry	L-93
Smith	L-11
Williams	L-17
Adams	L-16

3

Loan		
<u>bname</u>	<u>lno</u>	amt
Downtown	L-17	1000
Redwood	L-23	2000
Perry	L-15	1500
Downtown	L-14	1500
Mianus	L-93	500
R.H.	L-11	900
Perry	L-16	1300

Exercise: Draw the ER diagram for...

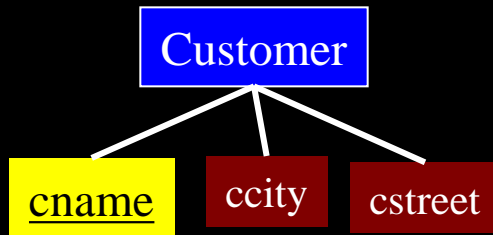
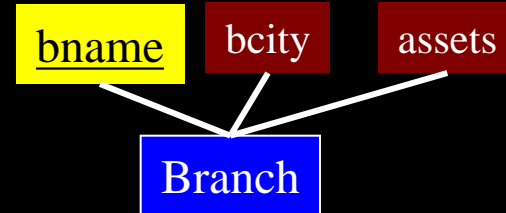
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Exercise: Draw the ER diagram for...



Exercise: Draw the ER diagram for...

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Brighton	Brooklyn	7.1M

2

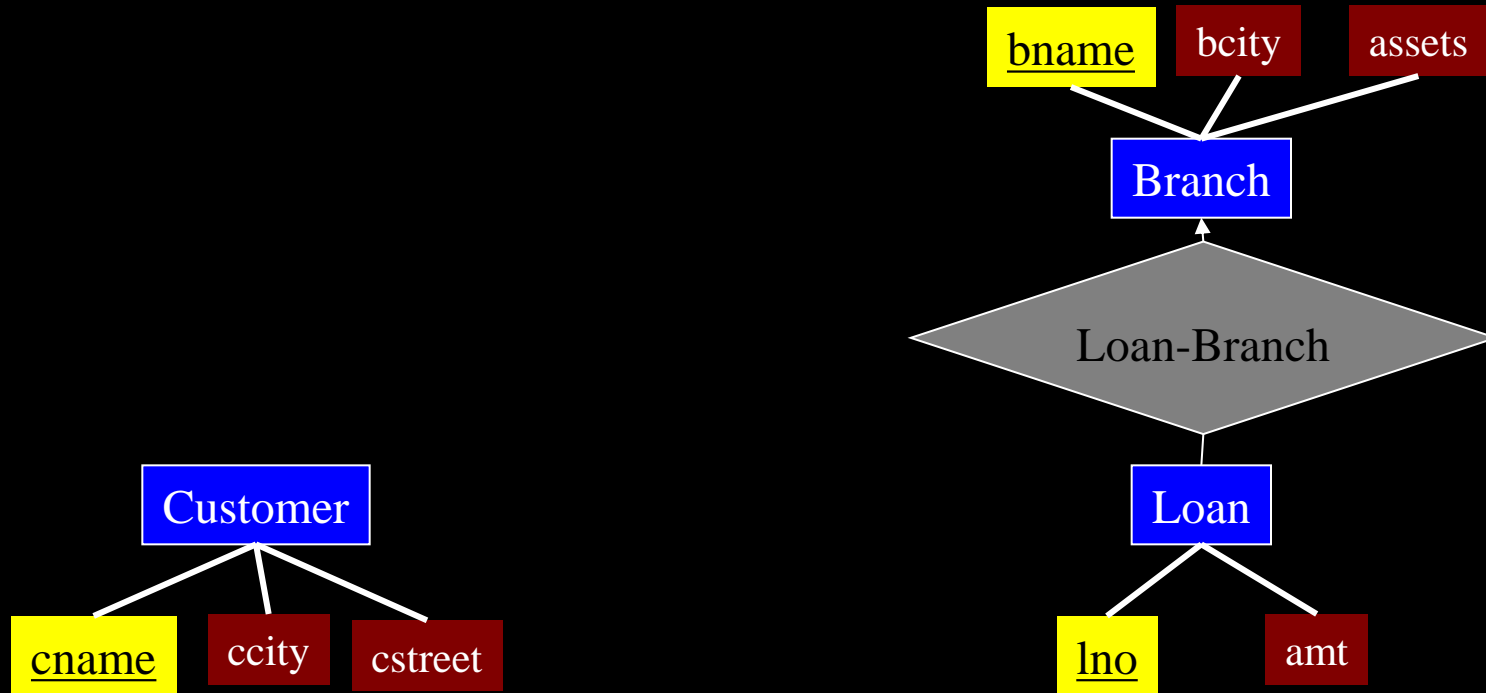
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<u>cname</u>	cstreet	ccity
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Smith	North	Rye
Hayes	Main	Harrison
Curry	North	Rye
Lindsay	Park	Pittsfield
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Exercise: Draw the ER diagram for...

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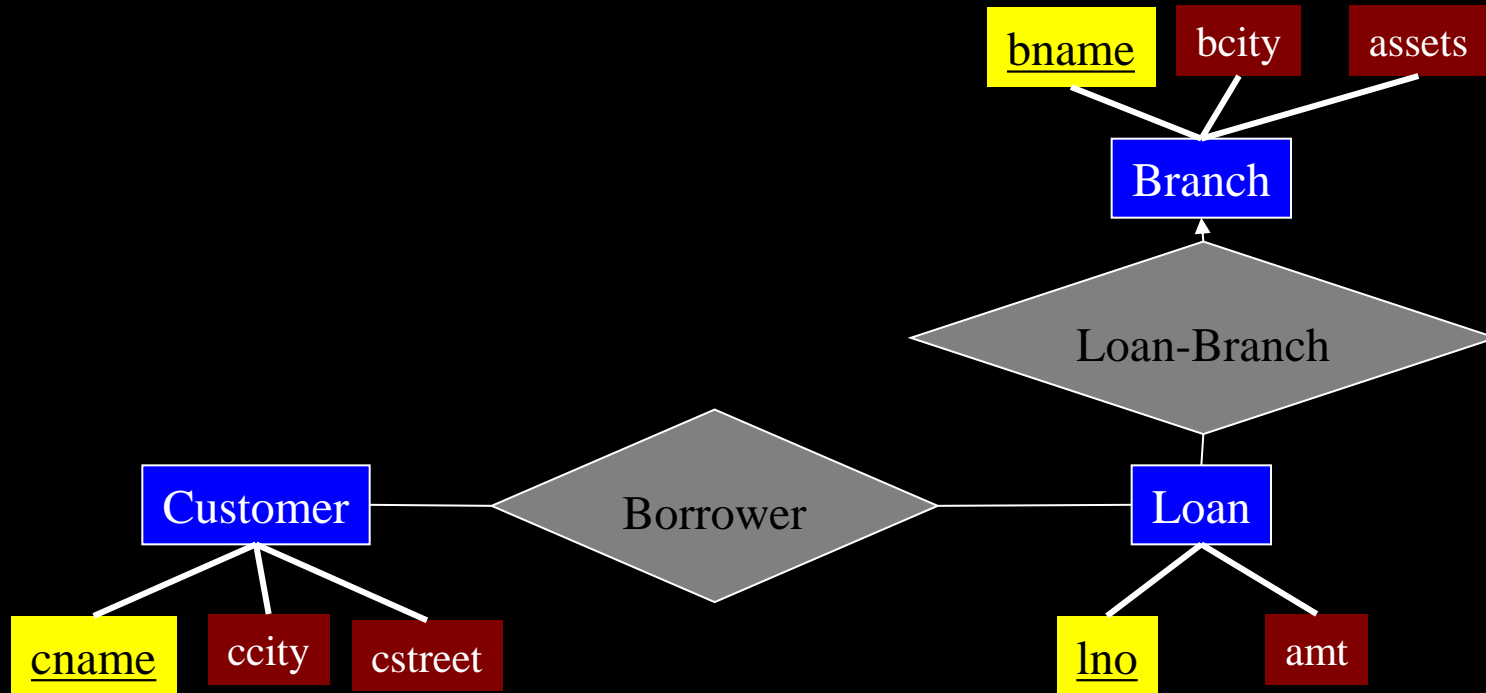
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Borrower	
<u>cname</u>	<u>lno</u>
Jones	L-17
Smith	L-23
Hayes	L-15
Jackson	L-14
Curry	L-93
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3

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Exercise: Draw the ER diagram for...



Exercise: Draw the ER diagram for...

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4

Borrower	
<u>cname</u>	<u>lno</u>
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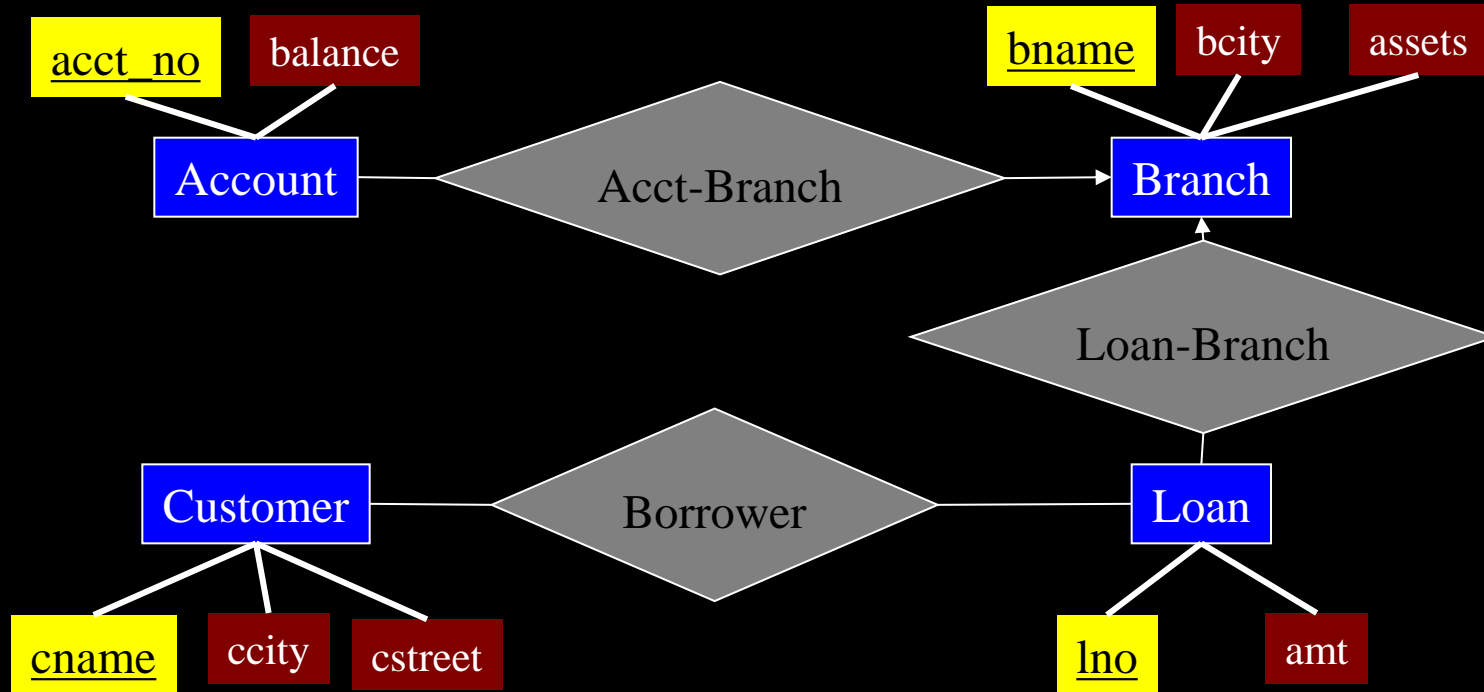
1

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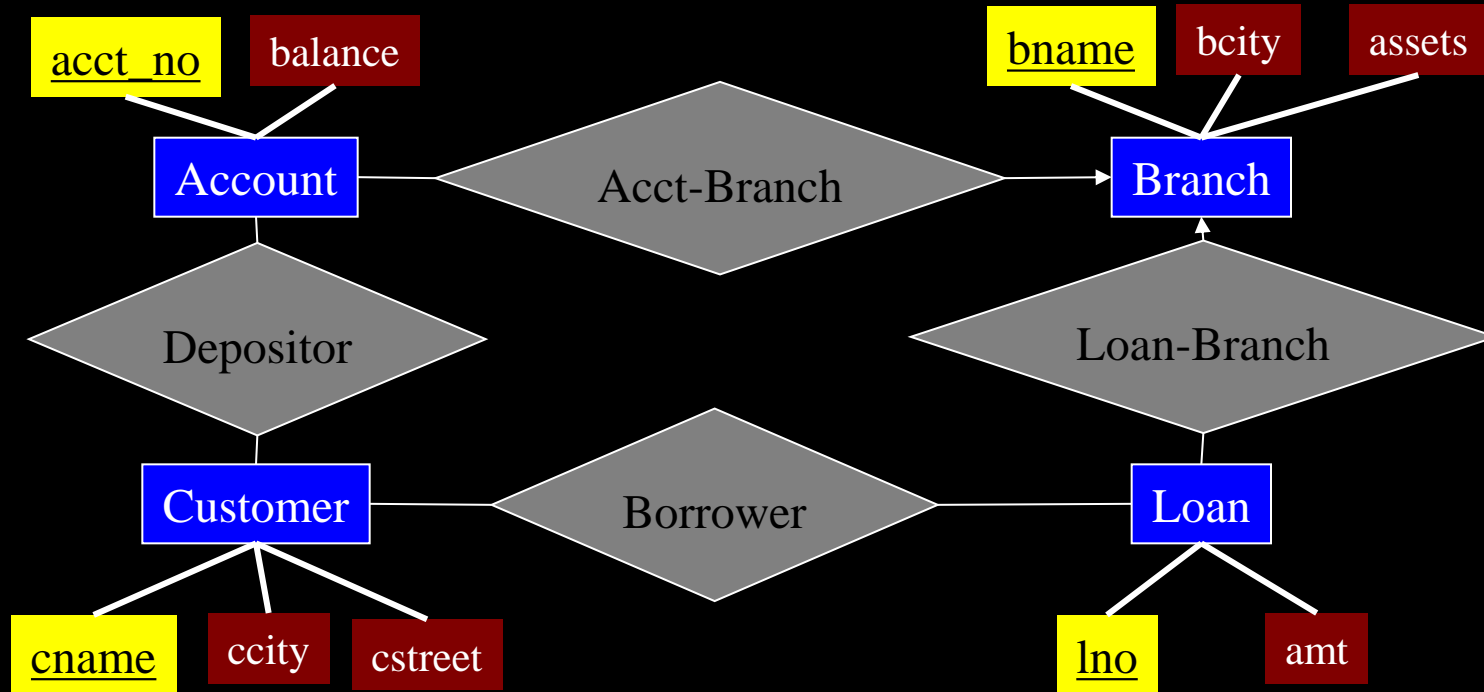
4

Borrower	
<u>cname</u>	<u>lno</u>
Jones	L-17
Smith	L-23
Hayes	L-15
Jackson	L-14
Curry	L-93
Smith	L-11
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Adams	L-16

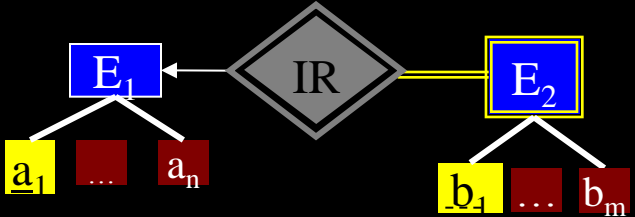
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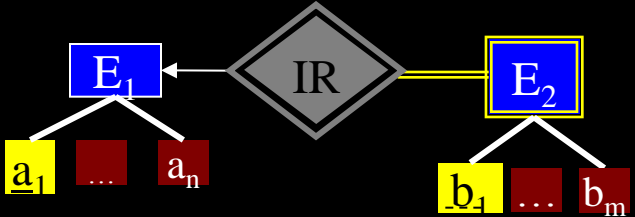
Exercise: Draw the ER diagram for...



E/R Diagrams and Relations

E/R	Relational Schema
<i>Weak Entity Sets</i>	
 <p>The diagram illustrates a weak entity set IR (represented by a double-bordered diamond) connecting two entity sets E_1 and E_2 (represented by double-bordered rectangles). E_1 has attributes $\underline{a_1}$, \dots, and a_n. E_2 has attributes $\underline{b_1}$, \dots, and b_m. A double line connects IR to E_2, while a single line connects IR to E_1.</p>	

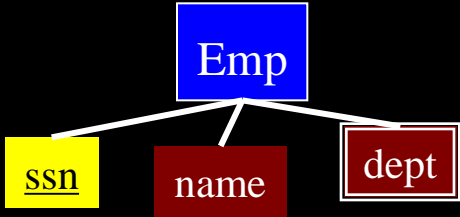
E/R Diagrams and Relations

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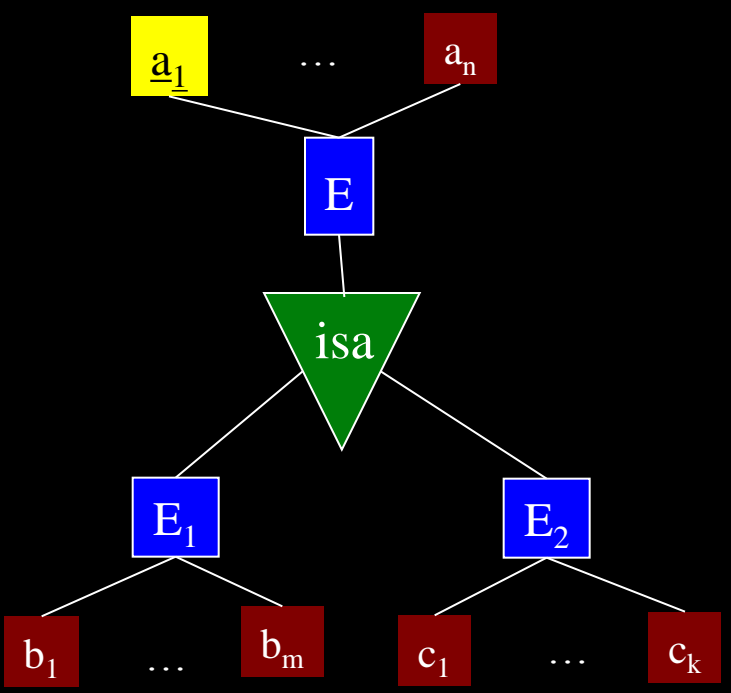
E/R Diagrams and Relations

E/R	Relational Schema
<i>Multivalued Attributes</i>	
<pre>graph TD; Emp[Emp] --- ssn[ssn]; Emp --- name[name]; Emp --- dept[dept];</pre>	

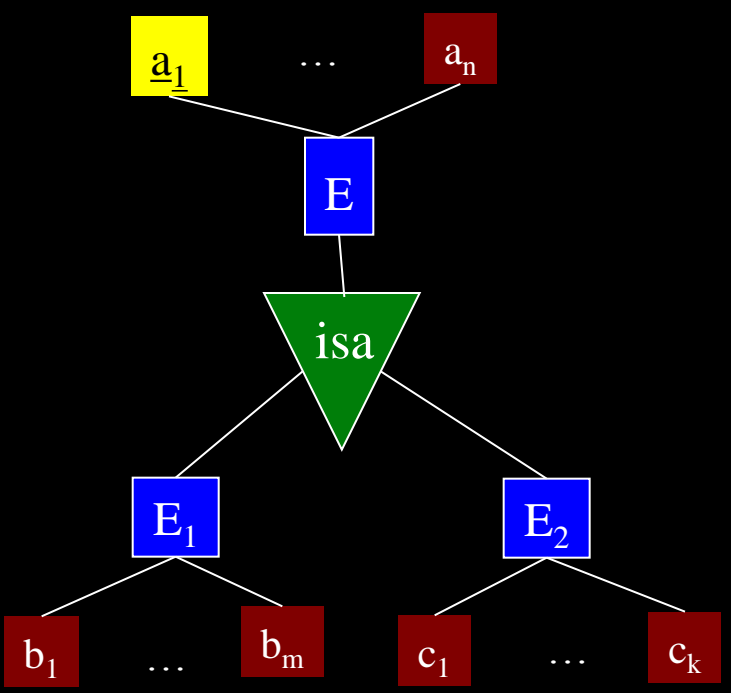
E/R Diagrams and Relations

E/R	Relational Schema														
<i>Multivalued Attributes</i>															
 <pre>graph TD; Emp[Emp] --- ssn[ssn]; Emp --- name[name]; Emp --- dept[dept];</pre>	<p>Emp = (<u>ssn</u>, name)</p> <p>Emp-Depts = (<u>ssn</u>, dept)</p> <table><thead><tr><th>ssn</th><th>name</th></tr></thead><tbody><tr><td>001</td><td>Smith</td></tr><tr><td>...</td><td>...</td></tr></tbody></table> <p>Emp</p> <table><thead><tr><th>ssn</th><th>dept</th></tr></thead><tbody><tr><td>001</td><td>Acct</td></tr><tr><td>001</td><td>Sales</td></tr><tr><td>...</td><td>...</td></tr></tbody></table> <p>Emp-Depts</p>	ssn	name	001	Smith	ssn	dept	001	Acct	001	Sales
ssn	name														
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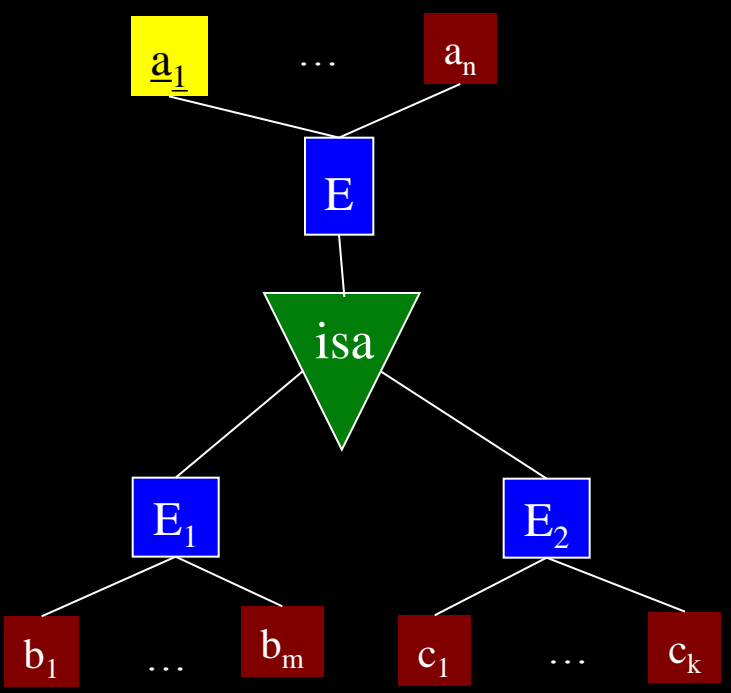
E/R Diagrams and Relations

E/R	Relational Schema
<i>Subclasses</i>	
 <p>The diagram illustrates a hierarchy of entities. At the top is entity E (blue square). It has two children: E_1 (blue square) and E_2 (blue square). E_1 has children b_1, \dots, b_m (red squares). E_2 has children c_1, \dots, c_k (red squares). E has children a_1, \dots, a_n (red squares). A green triangle labeled 'isa' is positioned between E and its children, indicating a subclass relationship.</p>	

E/R Diagrams and Relations

E/R	Relational Schema
<p><i>Subclasses</i></p>  <pre> graph TD E[E] --- isa{isa} isa --- E1[E1] isa --- E2[E2] E --- a1[a1] E --- dots1[...] E --- an[an] E1 --- b1[b1] E1 --- dots2[...] E1 --- bm[bm] E2 --- c1[c1] E2 --- dots3[...] E2 --- ck[ck] style a1 fill:#ffff00 style E fill:#0000ff,color:#ffffff style E1 fill:#0000ff,color:#ffffff style E2 fill:#0000ff,color:#ffffff style b1 fill:#800000,color:#ffffff style bm fill:#800000,color:#ffffff style c1 fill:#800000,color:#ffffff style ck fill:#800000,color:#ffffff style isa fill:#008000,color:#ffffff </pre>	
	<p><u>Method 1:</u></p> $E = (\underline{a_1}, \dots, a_n)$ $E_1 = (\underline{a_1}, b_1, \dots, b_m)$ $E_2 = (\underline{a_1}, c_1, \dots, c_k)$

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E/R Diagrams and Relations

Subclasses example:

Method 1:

Account = (acct no, balance)
SAccount = (acct no, interest)
CAccount = (acct no, overdraft)

Method 2:

SAccount = (acct no, balance, interest)
CAccount = (acct no, balance, overdraft)

Q: When is method 2 not possible?

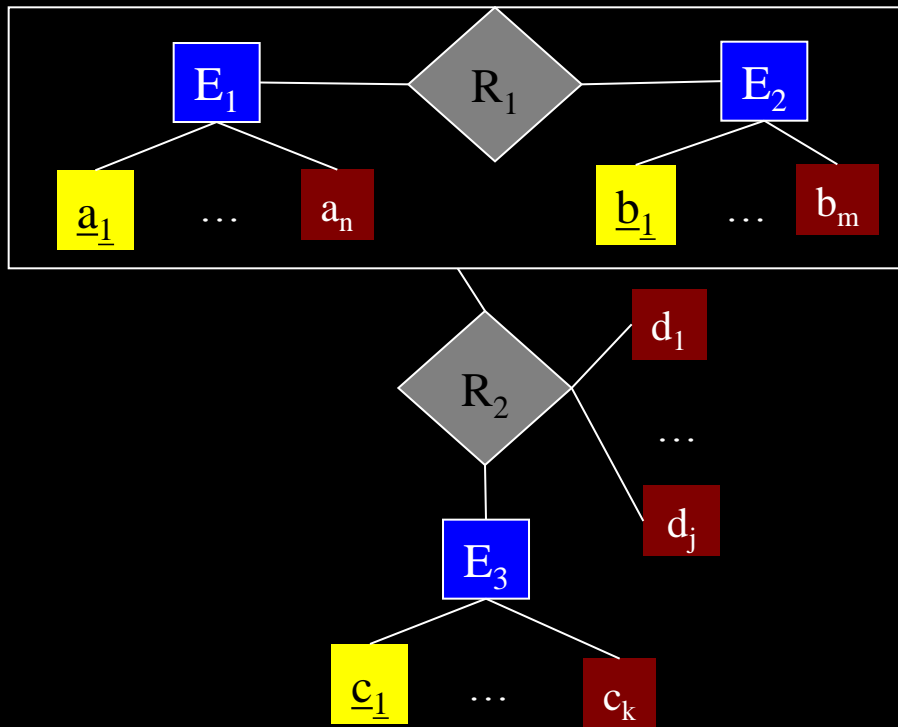
A: When subclassing is partial

E/R Diagrams and Relations

E/R

Relational Schema

Aggregation

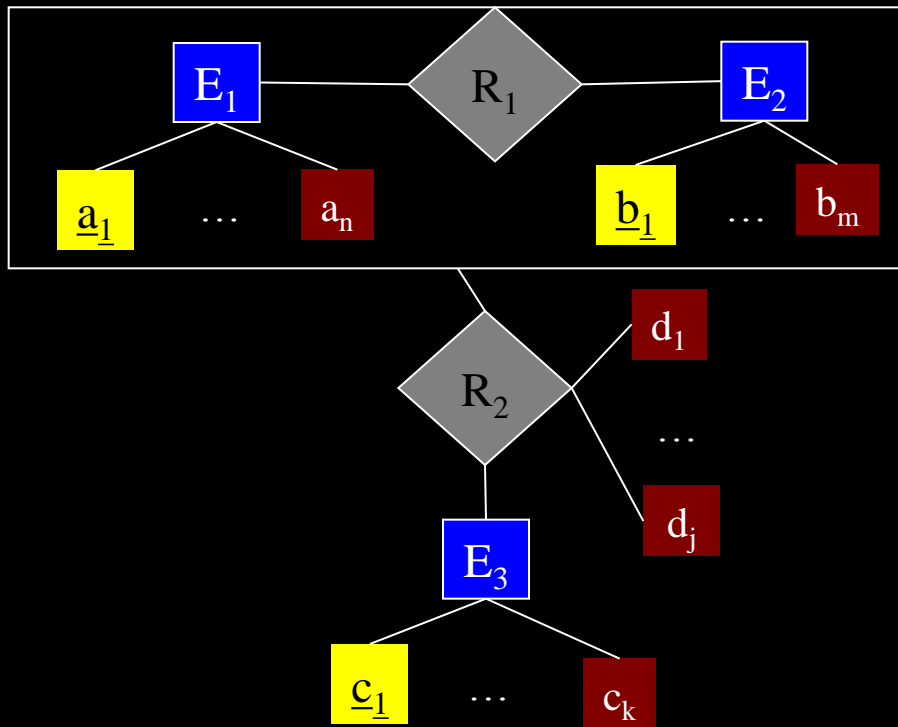


E/R Diagrams and Relations

E/R

Relational Schema

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E_1, E_2, E_3, R_1 as before

$R_2 = (\underline{c_1}, \underline{a_1}, \underline{b_1}, d_1, \dots, d_j)$

Good DB Design

Three Approaches:

1. Ad hoc:

- use **Entity-Relationship Model** to model data requirements
- translate **ER** design into relational schema

Issue: How to tell if design is "good"?

2. Theoretical:

- construct **universal relations** (e.g., Borrower-All)
- **decompose** above using known functional dependencies

Issue: Time-Consuming and Complex

3. Practical:

- use ER Model to produce 1st cut DB design
- use FDs to refine and verify

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Review: Functional Dependencies

In General:

$$A_1, \dots, A_n \rightarrow B$$

Informally:

If 2 tuples agree on their values for A_1, \dots, A_n ,
then they will also agree on their values for B

Formally:

$$\forall t, u \ (t[A_1] = u[A_1] \wedge \dots \wedge t[A_n] = u[A_n]) \Rightarrow t[B] = u[B])$$

Review: Deriving FDs

FD Sources:

1. Key Constraints (e.g.: **bname** \rightarrow **Branch**)
2. Known "many-to-one" (n::1) relationships
 - e.g.: **beer** \rightarrow **manufacturer**, **beer** \rightarrow **price**
3. Laws of Physics
 - e.g.: **time**, **room** \rightarrow **course**
4. Trial-and-error
 - given $R = (A, B, C)$, see which of the following make sense:

A \rightarrow B	A \rightarrow C	B \rightarrow A
B \rightarrow C	C \rightarrow A	C \rightarrow B
AB \rightarrow C	AC \rightarrow B	BC \rightarrow A

Deriving FDs: FD Closures (F^+)

Idea: Some FDs are implied by others

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
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e.g., $lno \rightarrow bname + bname \rightarrow bcity$ implies

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e.g., $\text{lno} \rightarrow \text{bname} + \text{bname} \rightarrow \text{bcity}$ implies $\text{lno} \rightarrow \text{bcity}$

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Q: Is $\{\text{lno} \rightarrow \text{bname}, \text{bname} \rightarrow \text{bcity}\}$

equivalent to

$\{\text{lno} \rightarrow \text{bname}, \text{bname} \rightarrow \text{bcity}, \text{lno} \rightarrow \text{bcity}\}$?

Deriving FDs: FD Closures (F^+)

Idea: Some FDs are implied by others

$\{\text{lno} \rightarrow \text{bname}, \text{bname} \rightarrow \text{bcity}\}$

\equiv

$\{\text{lno} \rightarrow \text{bname}, \text{bname} \rightarrow \text{bcity}, \text{lno} \rightarrow \text{bcity}\}$

?

\equiv

$\{\text{lno} \rightarrow \text{bname bcity}, \text{bname} \rightarrow \text{bcity}, \text{lno} \rightarrow \text{bcity}\}$

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Deriving FDs: FD Closures (F^+)

Given FD sets over R , F and G , how to decide if $F \equiv G$?

- Idea: Compare sets of FDs that F , G imply (closures)

$$F \equiv G \text{ if and only if } F^+ = G^+$$

E.g., Given:

$R = (A, B, C, D, E, H)$

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

$G = \{A \rightarrow BH, B \rightarrow CE, D \rightarrow B\}$

Is $F \equiv G$? (Is $F^+ = G^+$?)

Computing FD Closures

Algorithm 1: Using Attribute Closures

- Z^+ = set of attributes determined by set of attributes, Z
- can use attribute closures to compute F^+ by determining:

$$Z \rightarrow Z^+$$

for all subsets of attributes, Z

Example:

for $F = \{ AC \rightarrow B, B \rightarrow A \} :$

compute $F^+ = \{ A \rightarrow A^+, B \rightarrow B^+, C \rightarrow C^+,$
 $AB \rightarrow AB^+, AC \rightarrow AC^+, BC \rightarrow BC^+,$
 $ABC \rightarrow ABC^+ \}$

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  Result  $\leftarrow$  Z
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Att-Closure ($\{C, D\}, F$) :

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What is CD^+ ? (the closure of $\{C, D\}$ wrt F)

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A: No, but may change the # of passes of the algorithm required to reach “stability”.

Exercise

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Att-Closure ($\{A, C, D\}, F$) :

Iteration #	result
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1	

Exercise

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Iteration #	result
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2	

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0	$\{A, C, D\}$
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After iteration 1,

$ACD^+ = R.$

Must be in stable state

Aside: Attribute Closures and Keys

```
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END
```

$F = \{A \rightarrow BC, D \rightarrow B, A \rightarrow E, AC \rightarrow H, B \rightarrow CE\}$

What is ACD^+ ? (the closure of $\{A, C, D\}$ wrt F)

Att-Closure ($\{A, C, D\}, F$) :

Iteration #	result
0	$\{A, C, D\}$
1	$\{A, C, D, B, E, H\}$
2	$\{A, C, D, B, E, H\}$

After iteration 1,

$ACD^+ = R.$

Must be in stable state

Aside: Attribute Closures and Keys

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

Is $\{A, C, D\}$ (ACD) a superkey of $R = (A, B, C, D, E, H)$?

A: Yes, because $ACD^+ \rightarrow R$

Is $\{A, C, D\}$ (ACD) a candidate key of $R = (A, B, C, D, E, H)$?

A: Conditions that must be true for the answer to be yes:

- 1. $ACD^+ \rightarrow R$ *must be a superkey*
 - 2. $CD^+ \not\rightarrow R$
 - 3. $AC^+ \not\rightarrow R$
 - 4. $AD^+ \not\rightarrow R$
- } *must be minimal (subtracting any attribute makes it not a key)*

We Answered this Earlier

```
ALGORITHM Att-Closure (Z: {Attributes}, F: {FDs})
BEGIN
  Result  $\leftarrow$  Z
  REPEAT UNTIL STABLE
    FOR EACH functional dependency in F,  $X \rightarrow Y$  DO
      IF  $X \subseteq$  Result THEN Result  $\leftarrow$  Result  $\cup$  Y
  RETURN Result
END
```

$F = \{A \rightarrow BC, D \rightarrow B, A \rightarrow E, AC \rightarrow H, B \rightarrow CE\}$

What is CD^+ ? (the closure of $\{C, D\}$ wrt F)

Att-Closure ($\{C, D\}, F$) :

Iteration #	result
0	{C, D}
1	{C, D, B, E}
2	{C, D, B, E}

Aside: Attribute Closures and Keys

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

Is $\{A, C, D\}$ (ACD) a superkey of $R = (A, B, C, D, E, H)$?

A: Yes, because $ACD^+ \rightarrow R$

Is $\{A, C, D\}$ (ACD) a candidate key of $R = (A, B, C, D, E, H)$?

A: Conditions that must be true for the answer to be yes:

- 1. $ACD^+ \rightarrow R$ *must be a superkey*
 - 2. $CD^+ \not\rightarrow R$
 - 3. $AC^+ \not\rightarrow R$
 - 4. $AD^+ \not\rightarrow R$
- must be minimal (subtracting any attribute makes it not a key)*

Aside: Attribute Closures and Keys

```
ALGORITHM Att-Closure (Z: {Attributes}, F: {FDs})
BEGIN
  Result  $\leftarrow$  Z
  REPEAT UNTIL STABLE
    FOR EACH functional dependency in F,  $X \rightarrow Y$  DO
      IF  $X \subseteq \text{Result}$  THEN Result  $\leftarrow$  Result  $\cup$  Y
  RETURN Result
END
```

$F = \{A \rightarrow BC, D \rightarrow B, A \rightarrow E, AC \rightarrow H, B \rightarrow CE\}$

What is AC^+ ? (the closure of $\{A, C\}$ wrt F)

Att-Closure ($\{A, C\}, F$) :

Iteration #	result
0	$\{A, C\}$

Aside: Attribute Closures and Keys

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

Is $\{A, C, D\}$ (ACD) a superkey of $R = (A, B, C, D, E, H)$?

A: Yes, because $ACD^+ \rightarrow R$

Is $\{A, C, D\}$ (ACD) a candidate key of $R = (A, B, C, D, E, H)$?

A: Conditions that must be true for the answer to be yes:

- ✓ 1. $ACD^+ \rightarrow R$ *must be a superkey*
 - ✓ 2. $CD^+ \not\rightarrow R$
 - ✓ 3. $AC^+ \not\rightarrow R$
 - 4. $AD^+ \not\rightarrow R$
- } *must be minimal (subtracting any attribute makes it not a key)*

Aside: Attribute Closures and Keys

```
ALGORITHM Att-Closure (Z: {Attributes}, F: {FDs})
BEGIN
  Result  $\leftarrow$  Z
  REPEAT UNTIL STABLE
    FOR EACH functional dependency in F,  $X \rightarrow Y$  DO
      IF  $X \subseteq \text{Result}$  THEN Result  $\leftarrow$  Result  $\cup$  Y
  RETURN Result
END
```

$F = \{A \rightarrow BC, D \rightarrow B, A \rightarrow E, AC \rightarrow H, B \rightarrow CE\}$

What is AD^+ ? (the closure of $\{A, D\}$ wrt F)

Att-Closure ($\{A, D\}, F$) :

Iteration #	result
0	$\{A, D\}$

Aside: Attribute Closures and Keys

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

Is $\{A, C, D\}$ (ACD) a *superkey* of $R = (A, B, C, D, E, H)$?

A: Yes, because $ACD^+ \rightarrow R$

Is $\{A, C, D\}$ (ACD) a *candidate key* of $R = (A, B, C, D, E, H)$?

A: Conditions that must be true for the answer to be yes:

- 1. $ACD^+ \rightarrow R$ *must be a superkey*
 - 2. $CD^+ \not\rightarrow R$
 - 3. $AC^+ \not\rightarrow R$
 - 4. $AD^+ \not\rightarrow R$
- } *must be minimal (subtracting any attribute makes it not a key)*

Therefore, ACD is not a candidate key of R

Exercise

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

Is $\{A,D\}$ (AD) a candidate key of $R = (A,B,C,D,E,H)$?

A: *Conditions that must be true for the answer to be yes:*

1. $AD^+ \rightarrow R$ *must be a superkey*
2. $A^+ \not\rightarrow R$
3. $D^+ \not\rightarrow R$ } *must be minimal (subtracting any attribute makes it not a key)*

```
ALGORITHM Att-Closure (Z: {Attributes}, F: {FDs})
BEGIN
  Result  $\leftarrow$  Z
  REPEAT UNTIL STABLE
    FOR EACH functional dependency in F,  $X \rightarrow Y$  DO
      IF  $X \subseteq$  Result THEN Result  $\leftarrow$  Result  $\cup$  Y
  RETURN Result
END
```

Exercise Solution

```
ALGORITHM Att-Closure (Z: {Attributes}, F: {FDs})
BEGIN
  Result  $\leftarrow$  Z
  REPEAT UNTIL STABLE
    FOR EACH functional dependency in F,  $X \rightarrow Y$  DO
      IF  $X \subseteq$  Result THEN Result  $\leftarrow$  Result  $\cup$  Y
  RETURN Result
END
```

$F = \{A \rightarrow BC, D \rightarrow B, A \rightarrow E, AC \rightarrow H, B \rightarrow CE\}$

What is A^+ ? (the closure of $\{A\}$ wrt F)

Att-Closure ($\{A\}, F$) :

Iteration #	result
0	{A}
1	{A, B, C, E, H}
2	{A, B, C, E, H}

$A^+ \neq R$

Exercise Solution

$$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$$

Is $\{A,D\}$ (AD) a candidate key of $R = (A,B,C,D,E,H)$?

A: *Conditions that must be true for the answer to be yes:*

1. $AD^+ \rightarrow R$ *must be a superkey*
2. $A^+ \not\rightarrow R$
3. $D^+ \not\rightarrow R$ *must be minimal (subtracting any attribute makes it not a key)*

Exercise Solution

```
ALGORITHM Att-Closure (Z: {Attributes}, F: {FDs})
BEGIN
  Result  $\leftarrow$  Z
  REPEAT UNTIL STABLE
    FOR EACH functional dependency in F,  $X \rightarrow Y$  DO
      IF  $X \subseteq$  Result THEN Result  $\leftarrow$  Result  $\cup$  Y
  RETURN Result
END
```

$F = \{A \rightarrow BC, D \rightarrow B, A \rightarrow E, AC \rightarrow H, B \rightarrow CE\}$

What is D^+ ? (the closure of $\{D\}$ wrt F)

Att-Closure ($\{D\}, F$) :

Iteration #	result
0	$\{D\}$
1	$\{D, B\}$
2	$\{D, B, C, E\}$
3	$\{D, B, C, E\}$

$D^+ \neq R$

Exercise Solution

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

Is $\{A,D\}$ (AD) a candidate key of $R = (A,B,C,D,E,H)$?

A: *Conditions that must be true for the answer to be yes:*

- ✓ 1. $AD^+ \rightarrow R$ *must be a superkey*
- ✓ 2. $A^+ \not\rightarrow R$
- ✓ 3. $D^+ \not\rightarrow R$ } *must be minimal (subtracting any attribute makes it not a key)*

Therefore, AD is a candidate key of R

Deriving FDs: FD Closures (F^+)

$F \equiv G$ if and only if $F^+ = G^+$

E.g., Given:

$R = (A, B, C, D, E, H)$

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

$G = \{A \rightarrow BH, B \rightarrow CE, D \rightarrow B\}$

Is $F \equiv G$? (Is $F^+ = G^+$?)

Computing FD Closures

Algorithm 1: Using Attribute Closures

```
ALGORITHM FD-Closure (F: {FDs})  
-- using Att-Closure  
BEGIN  
    Result  $\leftarrow \{\}$   
    Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
    FOREACH  $Z \subseteq$  Atts DO  
        Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
    RETURN Result  
END
```

```
ALGORITHM Att-Closure (Z: {Attributes}, F: {FDs})  
BEGIN  
    Result  $\leftarrow$  Z  
    REPEAT UNTIL STABLE  
        FOR EACH functional dependency in F,  $X \rightarrow Y$  DO  
            IF  $X \subseteq$  Result THEN Result  $\leftarrow$  Result  $\cup Y$   
    RETURN Result  
END
```

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Att-Closure  
BEGIN  
  Result  $\leftarrow \{\}$   
  Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
  FOREACH  $Z \subseteq$  Atts DO  
    Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
  RETURN Result  
END
```

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Att-Closure  
  BEGIN  
    Result  $\leftarrow \{\}$   
    Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
    FOREACH  $Z \subseteq$  Atts DO  
      Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
    RETURN Result  
  END
```

Result = {}

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Att-Closure  
  BEGIN  
    Result  $\leftarrow \{\}$   
    Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
    FOREACH  $Z \subseteq$  Atts DO  
      Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
    RETURN Result  
  END
```

Result =
 $\{A \rightarrow A^+\} \cup \{B \rightarrow B^+\} \cup \{C \rightarrow C^+\} \cup \{D \rightarrow D^+\} \cup \{E \rightarrow E^+\} \cup \{H \rightarrow H^+\} \cup \dots$

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Att-Closure  
  BEGIN  
    Result  $\leftarrow \{\}$   
    Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
    FOREACH  $Z \subseteq$  Atts DO  
      Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
    RETURN Result  
  END
```

Result =

$\{A \rightarrow A^+\} \cup \{B \rightarrow B^+\} \cup \{C \rightarrow C^+\} \cup \{D \rightarrow D^+\} \cup \{E \rightarrow E^+\} \cup \{H \rightarrow H^+\} \cup$
 $\{AB \rightarrow (AB)^+\} \cup \{AC \rightarrow (AC)^+\} \cup \{AD \rightarrow (AD)^+\} \cup \{AE \rightarrow (AE)^+\} \cup \{AH \rightarrow (AH)^+\} \cup$
 $\{BC \rightarrow (BC)^+\} \cup \{BD \rightarrow (BD)^+\} \cup \{BE \rightarrow (BE)^+\} \cup \{BH \rightarrow (BH)^+\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)^+\} \cup \{CH \rightarrow (CH)^+\} \cup \{DE \rightarrow (DE)^+\} \cup \{DH \rightarrow (DH)^+\} \cup \{EH \rightarrow (EH)^+\} \cup \dots$

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})
-- using Att-Closure
BEGIN
  Result  $\leftarrow \{\}$ 
  Atts  $\leftarrow$  <all attributes appearing in FDs in F>
  FOREACH  $Z \subseteq$  Atts DO
    Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$ 
  RETURN Result
END
```

Result =

$\{A \rightarrow A\} \cup \{B \rightarrow B\} \cup \{C \rightarrow C\} \cup \{D \rightarrow D\} \cup \{E \rightarrow E\} \cup \{H \rightarrow H\} \cup$
 $\{AB \rightarrow (AB)^+\} \cup \{AC \rightarrow (AC)^+\} \cup \{AD \rightarrow (AD)^+\} \cup \{AE \rightarrow (AE)^+\} \cup \{AH \rightarrow (AH)^+\} \cup$
 $\{BC \rightarrow (BC)^+\} \cup \{BD \rightarrow (BD)^+\} \cup \{BE \rightarrow (BE)^+\} \cup \{BH \rightarrow (BH)^+\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)^+\} \cup \{CH \rightarrow (CH)^+\} \cup \{DE \rightarrow (DE)^+\} \cup \{DH \rightarrow (DH)^+\} \cup \{EH \rightarrow (EH)^+\} \cup$
 $\{ABC \rightarrow (ABC)^+\} \cup \{ABD \rightarrow (ABD)^+\} \cup \{ABE \rightarrow (ABE)^+\} \cup \{ABH \rightarrow (ABH)^+\} \cup$
 $\{ACD \rightarrow ACDBEH\} \cup \{ACE \rightarrow (ACE)^+\} \cup \{ACH \rightarrow (ACH)^+\} \cup \{ADE \rightarrow (ADE)^+\} \cup$
 $\{ADH \rightarrow (ADH)^+\} \cup \{AEH \rightarrow (AEH)^+\} \cup \{BCD \rightarrow (BCD)^+\} \cup \{BCE \rightarrow (BCE)^+\} \cup$
 $\{BCH \rightarrow (BCH)^+\} \cup \{BDE \rightarrow (BDE)^+\} \cup \{BDH \rightarrow (BDH)^+\} \cup \{BEH \rightarrow (BEH)^+\} \cup$
 $\{CDE \rightarrow (CDE)^+\} \cup \{CDH \rightarrow (CDH)^+\} \cup \{CEH \rightarrow (CEH)^+\} \cup \{DEH \rightarrow (DEH)^+\} \cup \dots$

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Att-Closure  
  BEGIN  
    Result  $\leftarrow \{\}$   
    Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
    FOREACH  $Z \subseteq$  Atts DO  
      Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
    RETURN Result  
  END
```

Result =

$\{A \rightarrow A\} \cup \{B \rightarrow B\} \cup \{C \rightarrow C\} \cup \{D \rightarrow D\} \cup \{E \rightarrow E\} \cup \{H \rightarrow H\} \cup$
 $\{AB \rightarrow (AB)^+\} \cup \{AC \rightarrow (AC)^+\} \cup \{AD \rightarrow (AD)^+\} \cup \{AE \rightarrow (AE)^+\} \cup \{AH \rightarrow (AH)^+\} \cup$
 $\{BC \rightarrow (BC)^+\} \cup \{BD \rightarrow (BD)^+\} \cup \{BE \rightarrow (BE)^+\} \cup \{BH \rightarrow (BH)^+\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)^+\} \cup \{CH \rightarrow (CH)^+\} \cup \{DE \rightarrow (DE)^+\} \cup \{DH \rightarrow (DH)^+\} \cup \{EH \rightarrow (EH)^+\} \cup$
 $\{ABC \rightarrow (ABC)^+\} \cup \{ABD \rightarrow (ABD)^+\} \cup \{ABE \rightarrow (ABE)^+\} \cup \{ABH \rightarrow (ABH)^+\} \cup$
 $\{ACD \rightarrow ACDBEH\} \cup \{ACE \rightarrow (ACE)^+\} \cup \{ACH \rightarrow (ACH)^+\} \cup \{ADE \rightarrow (ADE)^+\} \cup$
 $\{ADH \rightarrow (ADH)^+\} \cup \{AEH \rightarrow (AEH)^+\} \cup \{BCD \rightarrow (BCD)^+\} \cup \{BCE \rightarrow (BCE)^+\} \cup$
 $\{BCH \rightarrow (BCH)^+\} \cup \{BDE \rightarrow (BDE)^+\} \cup \{BDH \rightarrow (BDH)^+\} \cup \{BEH \rightarrow (BEH)^+\} \cup$
 $\{CDE \rightarrow (CDE)^+\} \cup \{CDH \rightarrow (CDH)^+\} \cup \{CEH \rightarrow (CEH)^+\} \cup \{DEH \rightarrow (DEH)^+\} \cup$
 $\{ABCD \rightarrow (ABCD)^+\} \cup \{ABCE \rightarrow (ABCE)^+\} \cup \{ABCH \rightarrow (ABCH)^+\} \cup \{ABDE \rightarrow (ABDE)^+\} \cup$
 $\{ABEH \rightarrow (ABEH)^+\} \cup \{ACDE \rightarrow (ACDE)^+\} \cup \{ACEH \rightarrow (ACEH)^+\} \cup \{ADEH \rightarrow (ADEH)^+\} \cup$
 $\{BCDE \rightarrow (BCDE)^+\} \cup \{BCDH \rightarrow (BCDH)^+\} \cup \{BDEH \rightarrow (BDEH)^+\} \cup \{CDEH \rightarrow (CDEH)^+\} \cup \dots$

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
-- using Att-Closure  
BEGIN  
  Result  $\leftarrow \{\}$   
  Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
  FOREACH  $Z \subseteq$  Atts DO  
    Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
  RETURN Result  
END
```

Result =

$\{A \rightarrow A\} \cup \{B \rightarrow B\} \cup \{C \rightarrow C\} \cup \{D \rightarrow D\} \cup \{E \rightarrow E\} \cup \{H \rightarrow H\} \cup$
 $\{AB \rightarrow (AB)\} \cup \{AC \rightarrow (AC)\} \cup \{AD \rightarrow (AD)\} \cup \{AE \rightarrow (AE)\} \cup \{AH \rightarrow (AH)\} \cup$
 $\{BC \rightarrow (BC)\} \cup \{BD \rightarrow (BD)\} \cup \{BE \rightarrow (BE)\} \cup \{BH \rightarrow (BH)\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)\} \cup \{CH \rightarrow (CH)\} \cup \{DE \rightarrow (DE)\} \cup \{DH \rightarrow (DH)\} \cup \{EH \rightarrow (EH)\} \cup$
 $\{ABC \rightarrow (ABC)\} \cup \{ABD \rightarrow (ABD)\} \cup \{ABE \rightarrow (ABE)\} \cup \{ABH \rightarrow (ABH)\} \cup$
 $\{ACD \rightarrow ACDBEH\} \cup \{ACE \rightarrow (ACE)\} \cup \{ACH \rightarrow (ACH)\} \cup \{ADE \rightarrow (ADE)\} \cup$
 $\{ADH \rightarrow (ADH)\} \cup \{AEH \rightarrow (AEH)\} \cup \{BCD \rightarrow (BCD)\} \cup \{BCE \rightarrow (BCE)\} \cup$
 $\{BCH \rightarrow (BCH)\} \cup \{BDE \rightarrow (BDE)\} \cup \{BDH \rightarrow (BDH)\} \cup \{BEH \rightarrow (BEH)\} \cup$
 $\{CDE \rightarrow (CDE)\} \cup \{CDH \rightarrow (CDH)\} \cup \{CEH \rightarrow (CEH)\} \cup \{DEH \rightarrow (DEH)\} \cup$
 $\{ABCD \rightarrow (ABCD)\} \cup \{ABCE \rightarrow (ABCE)\} \cup \{ABCH \rightarrow (ABCH)\} \cup \{ABDE \rightarrow (ABDE)\} \cup$
 $\{ABEH \rightarrow (ABEH)\} \cup \{ACDE \rightarrow (ACDE)\} \cup \{ACEH \rightarrow (ACEH)\} \cup \{ADEH \rightarrow (ADEH)\} \cup$
 $\{BCDE \rightarrow (BCDE)\} \cup \{BCDH \rightarrow (BCDH)\} \cup \{BDEH \rightarrow (BDEH)\} \cup \{CDEH \rightarrow (CDEH)\} \cup$
 $\{ABCDE \rightarrow (ABCDE)\} \cup \{ABCDH \rightarrow (ABCDH)\} \cup \{BCDEH \rightarrow (BCDEH)\} \cup \dots$

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
-- using Att-Closure  
BEGIN  
  Result  $\leftarrow \{\}$   
  Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
  FOREACH  $Z \subseteq$  Atts DO  
    Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
  RETURN Result  
END
```

Result =

$\{A \rightarrow A\} \cup \{B \rightarrow B\} \cup \{C \rightarrow C\} \cup \{D \rightarrow D\} \cup \{E \rightarrow E\} \cup \{H \rightarrow H\} \cup$
 $\{AB \rightarrow (AB)^+\} \cup \{AC \rightarrow (AC)^+\} \cup \{AD \rightarrow (AD)^+\} \cup \{AE \rightarrow (AE)^+\} \cup \{AH \rightarrow (AH)^+\} \cup$
 $\{BC \rightarrow (BC)^+\} \cup \{BD \rightarrow (BD)^+\} \cup \{BE \rightarrow (BE)^+\} \cup \{BH \rightarrow (BH)^+\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)^+\} \cup \{CH \rightarrow (CH)^+\} \cup \{DE \rightarrow (DE)^+\} \cup \{DH \rightarrow (DH)^+\} \cup \{EH \rightarrow (EH)^+\} \cup$
 $\{ABC \rightarrow (ABC)^+\} \cup \{ABD \rightarrow (ABD)^+\} \cup \{ABE \rightarrow (ABE)^+\} \cup \{ABH \rightarrow (ABH)^+\} \cup$
 $\{ACD \rightarrow ACDBEH\} \cup \{ACE \rightarrow (ACE)^+\} \cup \{ACH \rightarrow (ACH)^+\} \cup \{ADE \rightarrow (ADE)^+\} \cup$
 $\{ADH \rightarrow (ADH)^+\} \cup \{AEH \rightarrow (AEH)^+\} \cup \{BCD \rightarrow (BCD)^+\} \cup \{BCE \rightarrow (BCE)^+\} \cup$
 $\{BCH \rightarrow (BCH)^+\} \cup \{BDE \rightarrow (BDE)^+\} \cup \{BDH \rightarrow (BDH)^+\} \cup \{BEH \rightarrow (BEH)^+\} \cup$
 $\{CDE \rightarrow (CDE)^+\} \cup \{CDH \rightarrow (CDH)^+\} \cup \{CEH \rightarrow (CEH)^+\} \cup \{DEH \rightarrow (DEH)^+\} \cup$
 $\{ABCD \rightarrow (ABCD)^+\} \cup \{ABCE \rightarrow (ABCE)^+\} \cup \{ABCH \rightarrow (ABCH)^+\} \cup \{ABDE \rightarrow (ABDE)^+\} \cup$
 $\{ABEH \rightarrow (ABEH)^+\} \cup \{ACDE \rightarrow (ACDE)^+\} \cup \{ACEH \rightarrow (ACEH)^+\} \cup \{ADEH \rightarrow (ADEH)^+\} \cup$
 $\{BCDE \rightarrow (BCDE)^+\} \cup \{BCDH \rightarrow (BCDH)^+\} \cup \{BDEH \rightarrow (BDEH)^+\} \cup \{CDEH \rightarrow (CDEH)^+\} \cup$
 $\{ABCDE \rightarrow (ABCDE)^+\} \cup \{ABCDH \rightarrow (ABCDH)^+\} \cup \{BCDEH \rightarrow (BCDEH)^+\} \cup$
 $\{ABCDEH \rightarrow (ABCDEH)^+\}$

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
-- using Att-Closure  
BEGIN  
  Result  $\leftarrow \{\}$   
  Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
  FOREACH  $Z \subseteq$  Atts DO  
    Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
  RETURN Result  
END
```

Result =

$\{ \{A \rightarrow A^+\} \cup \{B \rightarrow B^+\} \cup \{C \rightarrow C^+\} \cup \{D \rightarrow D^+\} \cup \{E \rightarrow E^+\} \cup \{H \rightarrow H^+\} \cup$
 $\{AB \rightarrow (AB)^+\} \cup \{AC \rightarrow (AC)^+\} \cup \{AD \rightarrow (AD)^+\} \cup \{AE \rightarrow (AE)^+\} \cup \{AH \rightarrow (AH)^+\} \cup$
 $\{BC \rightarrow (BC)^+\} \cup \{BD \rightarrow (BD)^+\} \cup \{BE \rightarrow (BE)^+\} \cup \{BH \rightarrow (BH)^+\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)^+\} \cup \{CH \rightarrow (CH)^+\} \cup \{DE \rightarrow (DE)^+\} \cup \{DH \rightarrow (DH)^+\} \cup \{EH \rightarrow (EH)^+\} \cup$
 $\{ABC \rightarrow (ABC)^+\} \cup \{ABD \rightarrow (ABD)^+\} \cup \{ABE \rightarrow (ABE)^+\} \cup \{ABH \rightarrow (ABH)^+\} \cup$
 $\{ACD \rightarrow ACDBEH\} \cup \{ACE \rightarrow (ACE)^+\} \cup \{ACH \rightarrow (ACH)^+\} \cup \{ADE \rightarrow (ADE)^+\} \cup$
 $\{ADH \rightarrow (ADH)^+\} \cup \{AEH \rightarrow (AEH)^+\} \cup \{BCD \rightarrow (BCD)^+\} \cup \{BCE \rightarrow (BCE)^+\} \cup$
 $\{BCH \rightarrow (BCH)^+\} \cup \{BDE \rightarrow (BDE)^+\} \cup \{BDH \rightarrow (BDH)^+\} \cup \{BEH \rightarrow (BEH)^+\} \cup$
 $\{CDE \rightarrow (CDE)^+\} \cup \{CDH \rightarrow (CDH)^+\} \cup \{CEH \rightarrow (CEH)^+\} \cup \{DEH \rightarrow (DEH)^+\} \cup$
 $\{ABCD \rightarrow (ABCD)^+\} \cup \{ABCE \rightarrow (ABCE)^+\} \cup \{ABCH \rightarrow (ABCH)^+\} \cup \{ABDE \rightarrow (ABDE)^+\} \cup$
 $\{ABEH \rightarrow (ABEH)^+\} \cup \{ACDE \rightarrow (ACDE)^+\} \cup \{ACEH \rightarrow (ACEH)^+\} \cup \{ADEH \rightarrow (ADEH)^+\} \cup$
 $\{BCDE \rightarrow (BCDE)^+\} \cup \{BCDH \rightarrow (BCDH)^+\} \cup \{BDEH \rightarrow (BDEH)^+\} \cup \{CDEH \rightarrow (CDEH)^+\} \cup$
 $\{ABCDE \rightarrow (ABCDE)^+\} \cup \{ABCDH \rightarrow (ABCDH)^+\} \cup \{BCDEH \rightarrow (BCDEH)^+\} \cup$
 $\{ABCDEH \rightarrow (ABCDEH)^+\} \}$

Computing F^+ With Attribute Closures

$$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$$

$F^+ =$

$\{ \{A \rightarrow A\} \cup \{B \rightarrow B\} \cup \{C \rightarrow C\} \cup \{D \rightarrow D\} \cup \{E \rightarrow E\} \cup \{H \rightarrow H\} \cup$
 $\{AB \rightarrow (AB)^+\} \cup \{AC \rightarrow (AC)^+\} \cup \{AD \rightarrow (AD)^+\} \cup \{AE \rightarrow (AE)^+\} \cup \{AH \rightarrow (AH)^+\} \cup$
 $\{BC \rightarrow (BC)^+\} \cup \{BD \rightarrow (BD)^+\} \cup \{BE \rightarrow (BE)^+\} \cup \{BH \rightarrow (BH)^+\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)^+\} \cup \{CH \rightarrow (CH)^+\} \cup \{DE \rightarrow (DE)^+\} \cup \{DH \rightarrow (DH)^+\} \cup \{EH \rightarrow (EH)^+\} \cup$
 $\{ABC \rightarrow (ABC)^+\} \cup \{ABD \rightarrow (ABD)^+\} \cup \{ABE \rightarrow (ABE)^+\} \cup \{ABH \rightarrow (ABH)^+\} \cup$
 $\{ACD \rightarrow ACDBEH\} \cup \{ACE \rightarrow (ACE)^+\} \cup \{ACH \rightarrow (ACH)^+\} \cup \{ADE \rightarrow (ADE)^+\} \cup$
 $\{ADH \rightarrow (ADH)^+\} \cup \{AEH \rightarrow (AEH)^+\} \cup \{BCD \rightarrow (BCD)^+\} \cup \{BCE \rightarrow (BCE)^+\} \cup$
 $\{BCH \rightarrow (BCH)^+\} \cup \{BDE \rightarrow (BDE)^+\} \cup \{BDH \rightarrow (BDH)^+\} \cup \{BEH \rightarrow (BEH)^+\} \cup$
 $\{CDE \rightarrow (CDE)^+\} \cup \{CDH \rightarrow (CDH)^+\} \cup \{CEH \rightarrow (CEH)^+\} \cup \{DEH \rightarrow (DEH)^+\} \cup$
 $\{ABCD \rightarrow (ABCD)^+\} \cup \{ABCE \rightarrow (ABCE)^+\} \cup \{ABCH \rightarrow (ABCH)^+\} \cup \{ABDE \rightarrow (ABDE)^+\} \cup$
 $\{ABEH \rightarrow (ABEH)^+\} \cup \{ACDE \rightarrow (ACDE)^+\} \cup \{ACEH \rightarrow (ACEH)^+\} \cup \{ADEH \rightarrow (ADEH)^+\} \cup$
 $\{BCDE \rightarrow (BCDE)^+\} \cup \{BCDH \rightarrow (BCDH)^+\} \cup \{BDEH \rightarrow (BDEH)^+\} \cup \{CDEH \rightarrow (CDEH)^+\} \cup$
 $\{ABCDE \rightarrow (ABCDE)^+\} \cup \{ABCDH \rightarrow (ABCDH)^+\} \cup \{BCDEH \rightarrow (BCDEH)^+\} \cup$
 $\{ABCDEH \rightarrow (ABCDEH)^+\} \}$

Computing F^+ With Attribute Closures

$$G = \{A \rightarrow BH, B \rightarrow CE, D \rightarrow B\}$$

$G^+ =$

$\{ \{A \rightarrow A\} \cup \{B \rightarrow B\} \cup \{C \rightarrow C\} \cup \{D \rightarrow D\} \cup \{E \rightarrow E\} \cup \{H \rightarrow H\} \cup$
 $\{AB \rightarrow (AB)^+\} \cup \{AC \rightarrow (AC)^+\} \cup \{AD \rightarrow (AD)^+\} \cup \{AE \rightarrow (AE)^+\} \cup \{AH \rightarrow (AH)^+\} \cup$
 $\{BC \rightarrow (BC)^+\} \cup \{BD \rightarrow (BD)^+\} \cup \{BE \rightarrow (BE)^+\} \cup \{BH \rightarrow (BH)^+\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)^+\} \cup \{CH \rightarrow (CH)^+\} \cup \{DE \rightarrow (DE)^+\} \cup \{DH \rightarrow (DH)^+\} \cup \{EH \rightarrow (EH)^+\} \cup$
 $\{ABC \rightarrow (ABC)^+\} \cup \{ABD \rightarrow (ABD)^+\} \cup \{ABE \rightarrow (ABE)^+\} \cup \{ABH \rightarrow (ABH)^+\} \cup$
 $\{ACD \rightarrow ACDBEH\} \cup \{ACE \rightarrow (ACE)^+\} \cup \{ACH \rightarrow (ACH)^+\} \cup \{ADE \rightarrow (ADE)^+\} \cup$
 $\{ADH \rightarrow (ADH)^+\} \cup \{AEH \rightarrow (AEH)^+\} \cup \{BCD \rightarrow (BCD)^+\} \cup \{BCE \rightarrow (BCE)^+\} \cup$
 $\{BCH \rightarrow (BCH)^+\} \cup \{BDE \rightarrow (BDE)^+\} \cup \{BDH \rightarrow (BDH)^+\} \cup \{BEH \rightarrow (BEH)^+\} \cup$
 $\{CDE \rightarrow (CDE)^+\} \cup \{CDH \rightarrow (CDH)^+\} \cup \{CEH \rightarrow (CEH)^+\} \cup \{DEH \rightarrow (DEH)^+\} \cup$
 $\{ABCD \rightarrow (ABCD)^+\} \cup \{ABCE \rightarrow (ABCE)^+\} \cup \{ABCH \rightarrow (ABCH)^+\} \cup \{ABDE \rightarrow (ABDE)^+\} \cup$
 $\{ABEH \rightarrow (ABEH)^+\} \cup \{ACDE \rightarrow (ACDE)^+\} \cup \{ACEH \rightarrow (ACEH)^+\} \cup \{ADEH \rightarrow (ADEH)^+\} \cup$
 $\{BCDE \rightarrow (BCDE)^+\} \cup \{BCDH \rightarrow (BCDH)^+\} \cup \{BDEH \rightarrow (BDEH)^+\} \cup \{CDEH \rightarrow (CDEH)^+\} \cup$
 $\{ABCDE \rightarrow (ABCDE)^+\} \cup \{ABCDH \rightarrow (ABCDH)^+\} \cup \{BCDEH \rightarrow (BCDEH)^+\} \cup$
 $\{ABCDEH \rightarrow (ABCDEH)^+\} \}$

Computing FD Closures

Algorithm 1: Using Attribute Closures

```
ALGORITHM FD-Closure (F: {FDs})  
-- using Att-Closure  
BEGIN  
    Result  $\leftarrow \{\}$   
    Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
    FOREACH  $Z \subseteq$  Atts DO  
        Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
    RETURN Result  
END
```

```
ALGORITHM Att-Closure (Z: {Attributes}, F: {FDs})  
BEGIN  
    Result  $\leftarrow$  Z  
    REPEAT UNTIL STABLE  
        FOR EACH functional dependency in F,  $X \rightarrow Y$  DO  
            IF  $X \subseteq$  Result THEN Result  $\leftarrow$  Result  $\cup Y$   
    RETURN Result  
END
```

Computing FD Closures

Algorithm 2: Using Armstrong's Axioms

1. Reflexivity

- if $Y \subseteq X$ then $X \rightarrow Y$

2. Augmentation

- if $X \rightarrow Y$ then $WX \rightarrow WY$

3. Transitivity

- if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

4. Union

- if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

5. Decomposition

- if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

6. Pseudotransitivity

- if $X \rightarrow Y$ and $WY \rightarrow Z$ then $WX \rightarrow Z$

Armstrong's Axioms

Reflexivity: if $Y \subseteq X$ then $X \rightarrow Y$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- justifies trivial FDs: e.g.,
 - $\{lno\} \subseteq \{lno\}$ implies:

Armstrong's Axioms

Reflexivity: if $Y \subseteq X$ then $X \rightarrow Y$

Borrower-All								
lno	cname	cstreet	ccity	bname	amt	bcity	assets	lno
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M	L-17
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M	L-23
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M	L-15
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M	L-17
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M	L-93
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M	L-11
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M	L-16

- justifies trivial FDs: e.g.,
 - $\{lno\} \subseteq \{lno\}$ implies: $lno \rightarrow lno$

Armstrong's Axioms

Reflexivity: if $Y \subseteq X$ then $X \rightarrow Y$

Borrower-All								
lno	cname	cstreet	ccity	bname	amt	bcity	assets	lno
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M	L-17
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M	L-23
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M	L-15
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M	L-17
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M	L-93
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M	L-11
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M	L-16

- justifies trivial FDs: e.g.,
 - $\{lno\} \subseteq \{lno\}$ implies: $lno \rightarrow lno$
 - $\{lno\} \subseteq \{lno, cname\}$ implies: $lno \text{ } cname \rightarrow lno$

Computing FD Closures

Algorithm 2: Using Armstrong's Axioms

1. Reflexivity

- if $Y \subseteq X$ then $X \rightarrow Y$

2. Augmentation

- if $X \rightarrow Y$ then $WX \rightarrow WY$

3. Transitivity

- if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

4. Union

- if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

5. Decomposition

- if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

6. Pseudotransitivity

- if $X \rightarrow Y$ and $WY \rightarrow Z$ then $WX \rightarrow Z$

Armstrong's Axioms

Augmentation: if $X \rightarrow Y$ then $WX \rightarrow WY$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $\mathbf{bname} \rightarrow \mathbf{bcity}$ implies:

Armstrong's Axioms

Augmentation: if $X \rightarrow Y$ then $WX \rightarrow WY$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $\text{bname} \rightarrow \text{bcity}$ implies: $\text{cname bname} \rightarrow \text{cname bcity}$

Computing FD Closures

Algorithm 2: Using Armstrong's Axioms

1. Reflexivity

• if $Y \subseteq X$ then $X \rightarrow Y$

2. Augmentation

• if $X \rightarrow Y$ then $WX \rightarrow WY$

3. Transitivity

• if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

4. Union

• if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

5. Decomposition

• if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

6. Pseudotransitivity

• if $X \rightarrow Y$ and $WY \rightarrow Z$ then $WX \rightarrow Z$

Armstrong's Axioms

Transitivity: if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $lno \rightarrow bname$ and $bname \rightarrow bcity$ implies:

Armstrong's Axioms

Transitivity: if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $lno \rightarrow bname$ and $bname \rightarrow bcity$ implies: $lno \rightarrow bcity$

Computing FD Closures

Algorithm 2: Using Armstrong's Axioms

1. Reflexivity

• if $Y \subseteq X$ then $X \rightarrow Y$

2. Augmentation

• if $X \rightarrow Y$ then $WX \rightarrow WY$

3. Transitivity

• if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

4. Union

• if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

5. Decomposition

• if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

6. Pseudotransitivity

• if $X \rightarrow Y$ and $WY \rightarrow Z$ then $WX \rightarrow Z$

Armstrong's Axioms

Union: if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $lno \rightarrow bname$ and $lno \rightarrow amt$ implies:

Armstrong's Axioms

Union: if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $lno \rightarrow bname$ and $lno \rightarrow amt$ implies: $lno \rightarrow bname \text{ } amt$

Computing FD Closures

Algorithm 2: Using Armstrong's Axioms

1. Reflexivity

• if $Y \subseteq X$ then $X \rightarrow Y$

2. Augmentation

• if $X \rightarrow Y$ then $WX \rightarrow WY$

3. Transitivity

• if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

4. Union

• if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

5. Decomposition

• if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

6. Pseudotransitivity

• if $X \rightarrow Y$ and $WY \rightarrow Z$ then $WX \rightarrow Z$

Armstrong's Axioms

Decomposition: if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $\text{bname} \rightarrow \text{bcity assets}$ implies:

Armstrong's Axioms

Decomposition: if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $bname \rightarrow bcity \text{ assets}$ implies: $bname \rightarrow bcity$, $bname \rightarrow assets$

Computing FD Closures

Algorithm 2: Using Armstrong's Axioms

1. Reflexivity

• if $Y \subseteq X$ then $X \rightarrow Y$

2. Augmentation

• if $X \rightarrow Y$ then $WX \rightarrow WY$

3. Transitivity

• if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

4. Union

• if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

5. Decomposition

• if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

6. Pseudotransitivity

• if $X \rightarrow Y$ and $WY \rightarrow Z$ then $WX \rightarrow Z$

Armstrong's Axioms

Pseudotransitivity: if $X \rightarrow Y$ and $WY \rightarrow Z$ then $WX \rightarrow Z$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $bcity\ assets \rightarrow bname$ and $cname\ bname \rightarrow lno$ implies:

Armstrong's Axioms

Pseudotransitivity: if $\mathbf{X} \rightarrow \mathbf{Y}$ and $\mathbf{WY} \rightarrow \mathbf{Z}$ then $\mathbf{WX} \rightarrow \mathbf{Z}$

Borrower-All							
lno	cname	cstreet	ccity	bname	amt	bcity	assets
L-17	Jones	Main	Harrison	Downtown	1000	Brooklyn	9M
L-23	Smith	North	Rye	Redwood	2000	Palo Alto	2.1M
L-15	Hayes	Main	Harrison	Perry	1500	Horseneck	1.7M
L-17	Jackson	Senator	Brooklyn	Downtown	1000	Brooklyn	9M
L-93	Curry	Walnut	Stanford	Mianus	500	Horseneck	0.4M
L-11	Smith	North	Rye	R.H.	900	Horseneck	8M
L-16	Adams	Spring	Pittsfield	Perry	1300	Horseneck	1.7M

- e.g.,
 - $\mathbf{bcity\ assets} \rightarrow \mathbf{bname}$ and $\mathbf{cname\ bname} \rightarrow \mathbf{lno}$ implies:
 $\mathbf{cname\ bcity\ assets} \rightarrow \mathbf{lno}$

Computing FD Closures

Algorithm 2: Using Armstrong's Axioms

1. Reflexivity

• if $Y \subseteq X$ then $X \rightarrow Y$

2. Augmentation

• if $X \rightarrow Y$ then $WX \rightarrow WY$

3. Transitivity

• if $X \rightarrow Y$ and $Y \rightarrow Z$ then $X \rightarrow Z$

4. Union

• if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

5. Decomposition

• if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

6. Pseudotransitivity

• if $X \rightarrow Y$ and $WY \rightarrow Z$ then $WX \rightarrow Z$

Computing FD Closures

Algorithm 2: Using Armstrong's Axioms

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Armstrong's Axioms  
BEGIN  
  Result  $\leftarrow$  F  
  REPEAT UNTIL STABLE  
    IF for any of Armstrong's Axioms (if A then B),  
      A matches part of Result THEN  
      Result  $\leftarrow$  Result  $\cup$  B  
  RETURN Result  
END
```

Computing F^+ With Armstrong's Axioms

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Armstrong's Axioms  
BEGIN  
  Result  $\leftarrow$  F  
  REPEAT UNTIL STABLE  
    IF for any of Armstrong's Axioms (if A then B),  
      A matches part of Result THEN  
      Result  $\leftarrow$  Result  $\cup$  B  
  RETURN Result  
END
```

F = {
 A \rightarrow BC,
 B \rightarrow CE,
 A \rightarrow E,
 AC \rightarrow H,
 D \rightarrow B
}

Computing F^+ With Armstrong's Axioms

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Armstrong's Axioms  
  BEGIN  
    Result  $\leftarrow$  F  
    REPEAT UNTIL STABLE  
      IF for any of Armstrong's Axioms (if A then B),  
        A matches part of Result THEN  
        Result  $\leftarrow$  Result  $\cup$  B  
    RETURN Result  
  END
```

F^+ = {

- (1) $A \rightarrow BC,$
- (2) $B \rightarrow CE,$
- (3) $A \rightarrow E,$
- (4) $AC \rightarrow H,$
- (5) $D \rightarrow B,$

Computing F^+ With Armstrong's Axioms

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Armstrong's Axioms  
BEGIN  
  Result  $\leftarrow$  F  
  REPEAT UNTIL STABLE  
    IF for any of Armstrong's Axioms (if A then B),  
      A matches part of Result THEN  
      Result  $\leftarrow$  Result  $\cup$  B  
  RETURN Result  
END
```

F^+ = {

- (1) $A \rightarrow BC,$
- (2) $B \rightarrow CE,$
- (3) $A \rightarrow E,$
- (4) $AC \rightarrow H,$
- (5) $D \rightarrow B,$

Computing F^+ With Armstrong's Axioms

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Armstrong's Axioms  
BEGIN  
  Result  $\leftarrow$  F  
  REPEAT UNTIL STABLE  
    IF for any of Armstrong's Axioms (if A then B),  
      A matches part of Result THEN  
      Result  $\leftarrow$  Result  $\cup$  B  
  RETURN Result  
END
```

F^+ = {

- (1) $A \rightarrow BC,$
- (2) $B \rightarrow CE,$
- (3) $A \rightarrow E,$
- (4) $AC \rightarrow H,$
- (5) $D \rightarrow B,$

Decomposition

if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

(6) $A \rightarrow B,$	decomposition (1)
(7) $A \rightarrow C,$	decomposition (1)

Computing F^+ With Armstrong's Axioms

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Armstrong's Axioms  
BEGIN  
  Result  $\leftarrow$  F  
  REPEAT UNTIL STABLE  
    IF for any of Armstrong's Axioms (if A then B),  
      A matches part of Result THEN  
      Result  $\leftarrow$  Result  $\cup$  B  
  RETURN Result  
END
```

F^+ = {

- (1) $A \rightarrow BC,$
- (2) $B \rightarrow CE,$
- (3) $A \rightarrow E,$
- (4) $AC \rightarrow H,$
- (5) $D \rightarrow B,$
- (6) $A \rightarrow B,$
- (7) $A \rightarrow C,$
- (8) $A \rightarrow CE,$

Transitivity

if $X \rightarrow Y$ and $Y \rightarrow Z$, then $X \rightarrow Z$

decomposition (1)

decomposition (1)

transitivity (6), (2)

Computing F^+ With Armstrong's Axioms

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Armstrong's Axioms  
BEGIN  
  Result  $\leftarrow$  F  
  REPEAT UNTIL STABLE  
    IF for any of Armstrong's Axioms (if A then B),  
      A matches part of Result THEN  
      Result  $\leftarrow$  Result  $\cup$  B  
  RETURN Result  
END
```

F^+ = {

- (1) $A \rightarrow BC$,
- (2) $B \rightarrow CE$,
- (3) $A \rightarrow E$,
- (4) $AC \rightarrow H$,
- (5) $D \rightarrow B$,
- (6) $A \rightarrow B$,
- (7) $A \rightarrow C$,
- (8) $A \rightarrow CE$,
- (9) $B \rightarrow C$,
- (10) $B \rightarrow E$,

Decomposition

if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

decomposition (1)
decomposition (1)
transitivity (6), (2)
decomposition (2)
decomposition (2)

Computing F^+ With Armstrong's Axioms

```
ALGORITHM FD-Closure (F: {FDs})
-- using Armstrong's Axioms
BEGIN
  Result  $\leftarrow$  F
  REPEAT UNTIL STABLE
    IF for any of Armstrong's Axioms (if A then B),
      A matches part of Result THEN
      Result  $\leftarrow$  Result  $\cup$  B
  RETURN Result
END
```

F^+ = {

- (1) $A \rightarrow BC$,
- (2) $B \rightarrow CE$,
- (3) $A \rightarrow E$,
- (4) $AC \rightarrow H$,
- (5) $D \rightarrow B$,
- (6) $A \rightarrow B$,
- (7) $A \rightarrow C$,
- (8) $A \rightarrow CE$,
- (9) $B \rightarrow C$,
- (10) $B \rightarrow E$,
- (11) $A \rightarrow H$,

Pseudotransitivity

if $X \rightarrow Y$ and $WY \rightarrow Z$, then $WX \rightarrow Z$

decomposition (1)

decomposition (1)

transitivity (6), (2)

decomposition (2)

decomposition (2)

pseudotransitivity (7), (4) ...}

Computing F^+ With Attribute Closures

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
-- using Att-Closure  
BEGIN  
  Result  $\leftarrow \{\}$   
  Atts  $\leftarrow$  <all attributes appearing in FDs in F>  
  FOREACH  $Z \subseteq$  Atts DO  
    Result  $\leftarrow$  Result  $\cup \{Z \rightarrow \text{Att-Closure}(Z, F)\}$   
  RETURN Result  
END
```

$F^+ =$

$\{ \{A \rightarrow A^+\} \cup \{B \rightarrow B^+\} \cup \{C \rightarrow C^+\} \cup \{D \rightarrow D^+\} \cup \{E \rightarrow E^+\} \cup \{H \rightarrow H^+\} \cup$
 $\{AB \rightarrow (AB)^+\} \cup \{AC \rightarrow (AC)^+\} \cup \{AD \rightarrow (AD)^+\} \cup \{AE \rightarrow (AE)^+\} \cup \{AH \rightarrow (AH)^+\} \cup$
 $\{BC \rightarrow (BC)^+\} \cup \{BD \rightarrow (BD)^+\} \cup \{BE \rightarrow (BE)^+\} \cup \{BH \rightarrow (BH)^+\} \cup \{CD \rightarrow CDBE\} \cup$
 $\{CE \rightarrow (CE)^+\} \cup \{CH \rightarrow (CH)^+\} \cup \{DE \rightarrow (DE)^+\} \cup \{DH \rightarrow (DH)^+\} \cup \{EH \rightarrow (EH)^+\} \cup$
 $\{ABC \rightarrow (ABC)^+\} \cup \{ABD \rightarrow (ABD)^+\} \cup \{ABE \rightarrow (ABE)^+\} \cup \{ABH \rightarrow (ABH)^+\} \cup$
 $\{ACD \rightarrow ACDBEH\} \cup \{ACE \rightarrow (ACE)^+\} \cup \{ACH \rightarrow (ACH)^+\} \cup \{ADE \rightarrow (ADE)^+\} \cup$
 $\{ADH \rightarrow (ADH)^+\} \cup \{AEH \rightarrow (AEH)^+\} \cup \{BCD \rightarrow (BCD)^+\} \cup \{BCE \rightarrow (BCE)^+\} \cup$
 $\{BCH \rightarrow (BCH)^+\} \cup \{BDE \rightarrow (BDE)^+\} \cup \{BDH \rightarrow (BDH)^+\} \cup \{BEH \rightarrow (BEH)^+\} \cup$
 $\{CDE \rightarrow (CDE)^+\} \cup \{CDH \rightarrow (CDH)^+\} \cup \{CEH \rightarrow (CEH)^+\} \cup \{DEH \rightarrow (DEH)^+\} \cup$
 $\{ABCD \rightarrow (ABCD)^+\} \cup \{ABCE \rightarrow (ABCE)^+\} \cup \{ABCH \rightarrow (ABCH)^+\} \cup \{ABDE \rightarrow (ABDE)^+\} \cup$
 $\{ABEH \rightarrow (ABEH)^+\} \cup \{ACDE \rightarrow (ACDE)^+\} \cup \{ACEH \rightarrow (ACEH)^+\} \cup \{ADEH \rightarrow (ADEH)^+\} \cup$
 $\{BCDE \rightarrow (BCDE)^+\} \cup \{BCDH \rightarrow (BCDH)^+\} \cup \{BDEH \rightarrow (BDEH)^+\} \cup \{CDEH \rightarrow (CDEH)^+\} \cup$
 $\{ABCDE \rightarrow (ABCDE)^+\} \cup \{ABCDH \rightarrow (ABCDH)^+\} \cup \{BCDEH \rightarrow (BCDEH)^+\} \cup$
 $\{ABCDEH \rightarrow (ABCDEH)^+\} \}$

Computing F^+ With Armstrongs Axioms

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

```
ALGORITHM FD-Closure (F: {FDs})  
-- using Armstrong's Axioms  
BEGIN  
  Result  $\leftarrow$  F  
  REPEAT UNTIL STABLE  
    IF for any of Armstrong's Axioms (if A then B),  
      A matches part of Result THEN  
      Result  $\leftarrow$  Result  $\cup$  B  
  RETURN Result  
END
```

$F^+ =$

```
{ {A  $\rightarrow$  A+}  $\cup$  {B  $\rightarrow$  B+}  $\cup$  {C  $\rightarrow$  C+}  $\cup$  {D  $\rightarrow$  D+}  $\cup$  {E  $\rightarrow$  E+}  $\cup$  {H  $\rightarrow$  H+}  $\cup$   
{AB  $\rightarrow$  (AB)+}  $\cup$  {AC  $\rightarrow$  (AC)+}  $\cup$  {AD  $\rightarrow$  (AD)+}  $\cup$  {AE  $\rightarrow$  (AE)+}  $\cup$  {AH  $\rightarrow$  (AH)+}  $\cup$   
{BC  $\rightarrow$  (BC)+}  $\cup$  {BD  $\rightarrow$  (BD)+}  $\cup$  {BE  $\rightarrow$  (BE)+}  $\cup$  {BH  $\rightarrow$  (BH)+}  $\cup$  {CD  $\rightarrow$  CDBE}  $\cup$   
{CE  $\rightarrow$  (CE)+}  $\cup$  {CH  $\rightarrow$  (CH)+}  $\cup$  {DE  $\rightarrow$  (DE)+}  $\cup$  {DH  $\rightarrow$  (DH)+}  $\cup$  {EH  $\rightarrow$  (EH)+}  $\cup$   
{ABC  $\rightarrow$  (ABC)+}  $\cup$  {ABD  $\rightarrow$  (ABD)+}  $\cup$  {ABE  $\rightarrow$  (ABE)+}  $\cup$  {ABH  $\rightarrow$  (ABH)+}  $\cup$   
{ACD  $\rightarrow$  ACDBEH}  $\cup$  {ACE  $\rightarrow$  (ACE)+}  $\cup$  {ACH  $\rightarrow$  (ACH)+}  $\cup$  {ADE  $\rightarrow$  (ADE)+}  $\cup$   
{ADH  $\rightarrow$  (ADH)+}  $\cup$  {AEH  $\rightarrow$  (AEH)+}  $\cup$  {BCD  $\rightarrow$  (BCD)+}  $\cup$  {BCE  $\rightarrow$  (BCE)+}  $\cup$   
{BCH  $\rightarrow$  (BCH)+}  $\cup$  {BDE  $\rightarrow$  (BDE)+}  $\cup$  {BDH  $\rightarrow$  (BDH)+}  $\cup$  {BEH  $\rightarrow$  (BEH)+}  $\cup$   
{CDE  $\rightarrow$  (CDE)+}  $\cup$  {CDH  $\rightarrow$  (CDH)+}  $\cup$  {CEH  $\rightarrow$  (CEH)+}  $\cup$  {DEH  $\rightarrow$  (DEH)+}  $\cup$   
{ABCD  $\rightarrow$  (ABCD)+}  $\cup$  {ABCE  $\rightarrow$  (ABCE)+}  $\cup$  {ABCH  $\rightarrow$  (ABCH)+}  $\cup$  {ABDE  $\rightarrow$  (ABDE)+}  $\cup$   
{ABEH  $\rightarrow$  (ABEH)+}  $\cup$  {ACDE  $\rightarrow$  (ACDE)+}  $\cup$  {ACEH  $\rightarrow$  (ACEH)+}  $\cup$  {ADEH  $\rightarrow$  (ADEH)+}  $\cup$   
{BCDE  $\rightarrow$  (BCDE)+}  $\cup$  {BCDH  $\rightarrow$  (BCDH)+}  $\cup$  {BDEH  $\rightarrow$  (BDEH)+}  $\cup$  {CDEH  $\rightarrow$  (CDEH)+}  $\cup$   
{ABCDE  $\rightarrow$  (ABCDE)+}  $\cup$  {ABCDH  $\rightarrow$  (ABCDH)+}  $\cup$  {BCDEH  $\rightarrow$  (BCDEH)+}  $\cup$   
{ABCDEH  $\rightarrow$  (ABCDEH)+} }
```

Computing F^+ With Armstrongs Axioms

```
ALGORITHM FD-Closure (F: {FDs})  
  -- using Armstrong's Axioms  
BEGIN  
  Result  $\leftarrow$  F  
  REPEAT UNTIL STABLE  
    IF for any of Armstrong's Axioms (if A then B),  
      A matches part of Result THEN  
      Result  $\leftarrow$  Result  $\cup$  B  
  RETURN Result  
END
```

F^+ = {

- (1) $A \rightarrow BC$,
- (2) $B \rightarrow CE$,
- (3) $A \rightarrow E$,
- (4) $AC \rightarrow H$,
- (5) $D \rightarrow B$,
- (6) $A \rightarrow B$,
- (7) $A \rightarrow C$,
- (8) $A \rightarrow CE$,
- (9) $B \rightarrow C$,
- (10) $B \rightarrow E$,
- (11) $A \rightarrow H$,

Usually use Armstrong's Axioms selectively to make a point

decomposition (1)
decomposition (1)
transitivity (6), (2)
decomposition (2)
decomposition (2)
pseudotransitivity (7), (4) ...}

Selective use of Armstrong's Axioms

Another way to show that $F^+ = G^+$ ($F \equiv G$):

$$\begin{aligned} F &= \{ \mathbf{A} \rightarrow \mathbf{BC}, \mathbf{B} \rightarrow \mathbf{CE}, \mathbf{A} \rightarrow \mathbf{E}, \mathbf{AC} \rightarrow \mathbf{H}, \mathbf{D} \rightarrow \mathbf{B} \} \\ G &= \{ \mathbf{A} \rightarrow \mathbf{BH}, \mathbf{B} \rightarrow \mathbf{CE}, \mathbf{D} \rightarrow \mathbf{B} \} \end{aligned}$$

Strategy: Use Armstrong's Axioms to show:

1. $G \subseteq F^+$, and
2. $F \subseteq G^+$

Intuition:

$$\left. \begin{array}{l} G^+ \subseteq F^+ \\ F^+ \subseteq G^+ \end{array} \right\} \Rightarrow F^+ = G^+$$

Selective use of Armstrong's Axioms

Another way to show that $F^+ = G^+$ ($F \equiv G$):

$F = \{A \rightarrow BC, B \rightarrow CE, A \rightarrow E, AC \rightarrow H, D \rightarrow B\}$

$G = \{A \rightarrow BH, B \rightarrow CE, D \rightarrow B\}$

Strategy: Use Armstrong's Axioms to show:

1. $G \subseteq F^+$, and
2. $F \subseteq G^+$

Selective use of Armstrong's Axioms

Another way to show that $F^+ = G^+$ ($F \equiv G$):

$$\begin{aligned} F &= \{ \mathbf{A} \rightarrow \mathbf{BC}, \mathbf{B} \rightarrow \mathbf{CE}, \mathbf{A} \rightarrow \mathbf{E}, \mathbf{AC} \rightarrow \mathbf{H}, \mathbf{D} \rightarrow \mathbf{B} \} \\ G &= \{ \mathbf{A} \rightarrow \mathbf{BH}, \mathbf{B} \rightarrow \mathbf{CE}, \mathbf{D} \rightarrow \mathbf{B} \} \end{aligned}$$

Strategy: User Armstrong's Axioms to show...

1. $f \in G \Rightarrow f \in F^+$, and
2. $f \in F \Rightarrow f \in G^+$

Selective use of Armstrong's Axioms

Another way to show that $F^+ = G^+$ ($F \equiv G$):

$$\begin{aligned} F &= \{ \mathbf{A} \rightarrow \mathbf{BC}, \mathbf{B} \rightarrow \mathbf{CE}, \mathbf{A} \rightarrow \mathbf{E}, \mathbf{AC} \rightarrow \mathbf{H}, \mathbf{D} \rightarrow \mathbf{B} \} \\ G &= \{ \mathbf{A} \rightarrow \mathbf{BH}, \mathbf{B} \rightarrow \mathbf{CE}, \mathbf{D} \rightarrow \mathbf{B} \} \end{aligned}$$

Strategy: User Armstrong's Axioms to show...

$$1. \quad f \in G \Rightarrow f \in F^+$$

To prove (1), must show:

- a) $\mathbf{A} \rightarrow \mathbf{BH} \in F^+$
- b) $\mathbf{B} \rightarrow \mathbf{CE} \in F^+$
- c) $\mathbf{D} \rightarrow \mathbf{B} \in F^+$

Selective use of Armstrong's Axioms

Strategy: User Armstrong's Axioms to show...

To prove (1), must show:

$$\text{a) } 'A \rightarrow BH' \in F^+$$

Proof:

$$F^+ = \{ \begin{array}{l} 1. A \rightarrow BC, \\ 2. B \rightarrow CE, \\ 3. A \rightarrow E, \\ 4. AC \rightarrow H, \\ 5. D \rightarrow B, \end{array}$$

... }

Selective use of Armstrong's Axioms

Strategy: User Armstrong's Axioms to show...

To prove (1), must show:

a) $'A \rightarrow BH' \in F^+$

Proof:

$F^+ = \{$

1. $A \rightarrow BC,$
2. $B \rightarrow CE,$
3. $A \rightarrow E,$
4. $AC \rightarrow H,$
5. $D \rightarrow B,$
6. $A \rightarrow C,$
7. $A \rightarrow B,$

Decomposition

if $X \rightarrow YZ$ then $X \rightarrow Y$ and $X \rightarrow Z$

decomposition (1)

decomposition (1)

... }

Selective use of Armstrong's Axioms

Strategy: User Armstrong's Axioms to show...

To prove (1), must show:

a) $'A \rightarrow BH' \in F^+$

Proof:

$F^+ = \{$

1. $A \rightarrow BC,$
2. $B \rightarrow CE,$
3. $A \rightarrow E,$
4. $AC \rightarrow H,$
5. $D \rightarrow B,$
6. $A \rightarrow C,$
7. $A \rightarrow B,$
8. $A \rightarrow H,$

Pseudotransitivity

if $X \rightarrow Y$ and $WY \rightarrow Z$, then $WX \rightarrow Z$

decomposition (1)

decomposition (1)

pseudotransitivity (6, 4)

... }

Selective use of Armstrong's Axioms

Strategy: User Armstrong's Axioms to show...

To prove (1), must show:

a) $'A \rightarrow BH' \in F^+$

Proof:

$F^+ = \{$

1. $A \rightarrow BC,$
2. $B \rightarrow CE,$
3. $A \rightarrow E,$
4. $AC \rightarrow H,$
5. $D \rightarrow B,$
6. $A \rightarrow C,$
7. $A \rightarrow B,$
8. $A \rightarrow H,$
9. $A \rightarrow BH,$

Union

if $X \rightarrow Y$ and $X \rightarrow Z$ then $X \rightarrow YZ$

decomposition (1)

decomposition (1)

pseudotransitivity (6,4)

union (7,8) ... }

Selective use of Armstrong's Axioms

Strategy: User Armstrong's Axioms to show...

To prove (1), must show:

a) $'A \rightarrow BH' \in F^+$

Proof:

$$F^+ = \{ \begin{array}{ll} 1. & A \rightarrow BC, \\ 2. & B \rightarrow CE, \\ 3. & A \rightarrow E, \\ 4. & AC \rightarrow H, \\ 5. & D \rightarrow B, \\ 6. & A \rightarrow C, & \text{decomposition (1)} \\ 7. & A \rightarrow B, & \text{decomposition (1)} \\ 8. & A \rightarrow H, & \text{pseudotransitivity (6,4)} \\ 9. & A \rightarrow BH, & \text{union (7,8) ... } \end{array} \}$$

Selective use of Armstrong's Axioms

Strategy: User Armstrong's Axioms to show...

To prove (1), must show:

- a) $'A \rightarrow BH' \in F^+$ (9)
- b) $'B \rightarrow CE' \in F^+$
- c) $'D \rightarrow B' \in F^+$

Proof:

- $F^+ = \{$
- 1. $A \rightarrow BC,$
 - 2. $B \rightarrow CE,$
 - 3. $A \rightarrow E,$
 - 4. $AC \rightarrow H,$
 - 5. $D \rightarrow B,$
 - 6. $A \rightarrow C,$ decomposition (1)
 - 7. $A \rightarrow B,$ decomposition (1)
 - 8. $A \rightarrow H,$ pseudotransitivity (6,4)
 - 9. $A \rightarrow BH,$ union (7,8) ... }

Selective use of Armstrong's Axioms

Strategy: User Armstrong's Axioms to show...

To prove (1), must show:

$$\text{a) } 'A \rightarrow BH' \in F^+ \quad (9)$$

$$\text{b) } 'B \rightarrow CE' \in F^+ \quad (2)$$

$$\text{c) } 'D \rightarrow B' \in F^+ \quad (5)$$

Proof:

$$F^+ = \{ \begin{array}{ll} 1. & A \rightarrow BC, \\ 2. & B \rightarrow CE, \\ 3. & A \rightarrow E, \\ 4. & AC \rightarrow H, \\ 5. & D \rightarrow B, \\ 6. & A \rightarrow C, & \text{decomposition (1)} \\ 7. & A \rightarrow B, & \text{decomposition (1)} \\ 8. & A \rightarrow H, & \text{pseudotransitivity (6,4)} \\ 9. & A \rightarrow BH, & \text{union (7,8) ... } \end{array} \}$$

Selective use of Armstrong's Axioms

Another way to show that $F^+ = G^+$ ($F \equiv G$):

$$\begin{aligned} F &= \{ \mathbf{A} \rightarrow \mathbf{BC}, \mathbf{B} \rightarrow \mathbf{CE}, \mathbf{A} \rightarrow \mathbf{E}, \mathbf{AC} \rightarrow \mathbf{H}, \mathbf{D} \rightarrow \mathbf{B} \} \\ G &= \{ \mathbf{A} \rightarrow \mathbf{BH}, \mathbf{B} \rightarrow \mathbf{CE}, \mathbf{D} \rightarrow \mathbf{B} \} \end{aligned}$$

Strategy: User Armstrong's Axioms to show...

- ✓ 1. $f \in G \Rightarrow f \in F^+$, and
2. $f \in F \Rightarrow f \in G^+$