#### Lecture 15 n-ary Relations

**Definition**: An *n*-ary relation *R* on sets  $A_1, ..., A_n$ , written as  $R : A_1, ..., A_n$ , is a subset  $R \subseteq A_1 \times \cdots \times A_n$ .

• The sets A1, ..., An are called the domains of R. • The degree of R is n. R is functional in domain A<sub>i</sub> if it contains at most one n-tuple (..., a<sub>i</sub>,...) for any value a<sub>i</sub> within domain A<sub>i</sub>.

#### Transitive Relation and R<sup>n</sup>

**Theorem:** The relation R on a set A is transitive if and only if  $R^n \subseteq R$  for n = 1, 2, 3, ...

Proof:

- "if" part: In particular,  $R^2 \subseteq R$ . If  $(a, b) \in R$  and  $(b, c) \in R$ , then by the definition of composition, we have  $(a, c) \in R^2 \subseteq R$ . "only if: part: by induction.

- and yf: part. sp non--  $n = 1: R^2 \subseteq R$ Suppose  $R^n \subseteq R$ : \*  $(a, c) \in R^{n-1} \le R^n \le R$ , there is a  $b \in A$  such that  $(a, b) \in R$  and  $(b, c) \in R^n \subseteq R$ \* Since R is transitive,  $(a, b) \in R$  and  $(b, c) \in R^n \subseteq R$  implies that  $\ell \sim c \in R$

# Relational Databases

A domain  $A_i$  is a primary key for the database if the relation R is

Student_name	ID_number	Major	GPA
Ackermann	231455	Computer Science	3.88
Adams	888323	Physics	3.45
Chou	102147	Computer Science	3.49
Goodfriend	453876	Mathematics	3.45
Rao	678543	Mathematics	3.90
Stevens	786576	Psychology	2.99

#### Selection Operator

Let A be any n-ary domain  $A = A_1 \times \cdots \times A_n$ , and let  $C : A \to \{T, F\}$  be any condition (predicate) on elements (*n*-tuples) of A.

The selection operator  $s_C$  is the operator that maps any (*n*-ary) relation R on A to the *n*-ary relation of all *n*-tuples from R that satisfy C.

 $\forall R \subseteq A, s_C(R) = R \cap \{a \in A | s_C(a) = T\} = \{a \in R | s_C(a) = T\}$ Selection Operator: Example

Suppose that we have a domain

 $A = \mathsf{StudentName} \times \mathsf{Standing} \times \mathsf{SocSecNos}$ 

# Suppose that we have a condition

UpperLevel(name, standing, ssn)

 $\label{eq:projection Operator} \ensuremath{\mathsf{Projection Operator}} :\equiv [(\mathit{standing} = \mathit{junior}) \lor (\mathit{standing} = \mathit{senior})]$ Let  $A = A_1 \times \cdots \times A_n$  be any *n*-ary domain, and let  $\{i_k\} = (i_1, ..., i_m)$  be a sequence of indices all falling in the range 1 to *n*. That is, where  $1 \le i_k \le n$  for all  $1 \le k \le m$ .

Then the projection operator on *n*-tuples  $P_{i_k} : A \to A_{i_1} \times \cdots \times A_{i_m}$ 

is defined	$P_{i_k}(a_1,\cdots,a_n)$	, a <sub>im</sub> )	Example P1,		
Student	Major	Course			
Glauser Glauser	Biology Biology	BI 290 MS 475			
Glauser Marcus	Biology Mathematics	PY 410 MS 511	Student	Major	
Marcus Marcus Miller Miller	Mathematics Mathematics Computer Science Computer Science	MS 603 CS 322 MS 575 CS 455	Glauser Marcus Miller	Biology Mathematics Computer Science	

### Join Operator $J(R_1, R_2)$

N521 N502 N521	2.00 P.M 3.00 P.M 4.00 P.M
N521	
	4:00 P.M
B505	4.00 P.M
A100	3:00 P.M
A110	11:00 A.S
A100	9:00 A.5
A100	8:00 a.5
	A110 A100

A100 A100 A100 A110 B505 9:00 A.5 8:00 A.5 3:00 P.M 11:00 A.5 4:00 P.M 412 501 617 544

### Zero-One Matrix



Reflexive Symmetric Antisymmetric Join and Meet

Let  $A = [a_{ii}]$  and  $B = [b_{ii}]$  be  $m \times n$  zero-one matrices The join of A and B is the zero-one matrix with (i, j)-th entry  $a_{ij} \lor b_{ij}$ . The join of A and B is denoted by  $A \lor B$ .

The meet of A and B is the zero-one matrix with (i, j)-th entry  $a_{ij} \wedge b_{ij}$ The meet of A and B is denoted by  $A \wedge B$ .

$$M_{R_1\cup R_2}=M_{R_1}\vee M_{R_2}$$

$$M_{R_1\cap R_2}=M_{R_1}\wedge M_{R_2}$$

Zero-One Matrix: Composite of Relations Let  $A = [a_{ij}]$  be an  $m \times k$  zero-one matrix and  $B = [b_{ij}]$  be a  $k \times n$  zero-one matrix. Then, the Boolean product of A and B, denoted by  $A \odot B$ , is the m imes n matrix with (i,j)-th entry  $c_{ij}$  where

$$c_{ij} = (a_{i1} \land b_{ij}) \lor (a_{i2} \land b_{2j}) \lor \cdots \lor (a_{ik} \land b_{ij}).$$
$$\mathbf{A} = \begin{bmatrix} 1 & 0\\ 0 & 1\\ 1 & 0 \end{bmatrix}, \qquad \mathbf{B} = \begin{bmatrix} 1 & 1 & 0\\ 0 & 1 & 1 \end{bmatrix}.$$
$$\mathbf{A} \odot \mathbf{B} = \begin{bmatrix} 1 & 1 & 0\\ 0 & 1 & 1\\ 1 & 1 & 0 \end{bmatrix}$$

$W_{S\circ R} = W_{R} \odot W_{S}$					
The ordered pair $(a_i, c_j)$ belongs to $S \circ R$ if and only if there is an element					
$b_k$ such that $(a_i, b_k)$ belongs to R and $(b_k, c_j)$ belongs to S.					
$\mathbf{M}_{R} = \begin{bmatrix} 1 & 0 & 1 \\ 1 & 1 & 0 \\ 0 & 0 & 0 \end{bmatrix}  \text{and}  \mathbf{M}_{S} = \begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 1 & 0 & 1 \end{bmatrix}$					
$\mathbf{M}_{S \circ R} = \mathbf{M}_R \odot \mathbf{M}_S = \begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 1 \\ 0 & 0 & 0 \end{bmatrix}.$					
$\mathbf{M}_{S \circ R} = \mathbf{M}_R \odot \mathbf{M}_S = \begin{bmatrix} 0 & 1 & 1 \end{bmatrix}.$					
Closures of Relations					
Let $R = \{(1,1), (1,2), (2,1), (3,2)\}$ on $A = \{1,2,3\}$ .					

- Is this relation R reflexive? No. (2,2) and (3,3) are not in R. The question is what is the minimal relation  $S \supseteq R$  that is reflexive?
- How to make R reflexive by minimum number of additions? Add (2, 2) and (3, 3) Then  $S = \{(1, 1), (1, 2), (2, 1), (3, 2), (2, 2), (3, 3)\} \supseteq R$ .
- The minimal set  $S \supseteq R$  is called the reflexive closure of R. The set S is called the reflexive closure of R if it:
- contains R
- is reflexive • is minimal (is contained in every reflexive relation Q that contains R  $(R\subseteq Q),$  i.e.,  $S\subseteq Q)$
- Relations can have different properties:
- We define: reflexive reflexive closures symmetric transitive • symmetric closures
- transitive closures S is the minimal set containing R satisfying the property P

**Example**:  $R = \{(1, 2), (2, 3), (2, 2)\}$  on  $A = \{1, 2, 3\}$ . What is the symmetric closure S of R?

 $S = \{(1, 2), (2, 3), (2, 2), (2, 1), (3, 2)\}$ What is the transitive closure S of R?  $S = \{(1, 2), (2, 2), (2, 3), (1, 3)\}$ **Transitive Closure** 

**Example:**  $R = \{(1, 2), (2, 2), (2, 3)\}$  on  $A = \{1, 2, 3\}$ . Transitive closure:  $S = \{(1, 2), (2, 2), (2, 3), (1, 3)\}$ Paths in Directed Graphs

Definition: A path from a to b in the directed graph G is a sequence of edges  $(x_0, x_1)$ ,  $(x_1, x_2)$ , . . . ,  $(x_{n-1}, x_n)$  in *G*, where *n* is nonnegative and  $x_0 = a$  and  $x_n = b$ .

A path of length  $n \geq 1$  that begins and ends at the same vertex is called a

**Theorem**: Let R be relation on a set A. There is a path of length n from a to b if and only if  $(a, b) \in F$ 

# Connectivity Relation **Definition:** Let R be a relation on a set A. The connectivity relation R' consists of all pairs (a, b) such that there is a path (of any length) between a and b in R: $R^* = \bigcup_{k=1}^{\infty} R^k$

$$A = \{1, 2, 3, 4\}$$

 $R = \{(1,2), (1,3), (1,4), (2,3), (3,4)\}, \ R^2 = \{(1,3), (2,4), (1,4)\}$  $R^3 = \{(1, 4)\}, R^4 = \emptyset$ 

 $R^* = \{(1,2), (1,3), (1,4), (2,3), (2,4), (3,4)\}$ 

**Lemma:** Let A be a set with n elements, and R a relation on A. If there is a path from a to b with  $a \neq b$ , then there exists a path of length  $\leq n - 1$ . **Proof** (by intuition): There are at most n different elements we can visit on a path if the path does not have loops

Loops may increase the length but the same node is visited more than once

$$a = x_1 x_2 x_{m=b}$$

**Proof**: Suppose there is a path from *a* to *b* in R. Let *m* be the length of the shortest such path. Suppose that  $x_0, x_1, x_2, ..., x_m$ , where  $x_0 = a$  and  $x_m = b$ , is such a path.

Suppose that  $a \neq b$  and that  $m \ge n$ . The m + 1 vertices are from nelements. According to the pigeonhole principle and  $a \neq b$ , at least two of the vertices  $x_0, x_1, ..., x_{m-1}$  are equal.

There is a circuit that can be deleted until the length is < nLemma: Let A be a set with n elements, and R a relation on A. If there is path from a to b with  $a \neq b$ , then there exists a path of length

**Lemma:** If there is a path of length at least one in R from a to b, then there is such a path with length not exceeding n.

**Theorem:** The transitive closure of a relation R equals the connectivity relation  $R^*$ :  $R^* = \bigcup_{k=1}^{\infty} R^k$ 

• R\* is transitive If  $(a, b) \in R^*$  and  $(b, c) \in R^*$ , then there are paths from a to b and from b to c in R. Thus, there is a path from a to c in R. This means that  $(a, c) \in R^*$ . •  $R^* \subseteq S$  whenever S is a transitive relation containing R

- Suppose that S is a transitive relation containing R  $S^n \subseteq S$  for integer  $n \ge 1$ . (Recall S is transitive iff  $S^n \subseteq S$ ). We have  $S^n \subseteq S \subseteq S$ . We have S\*
- we have  $S^* \subseteq S$ . If  $R \subseteq S$ , then  $R^* \subseteq S^*$ , because any path in R is also a path in S. Thus,  $R^* \subseteq S^* \subseteq S$ . Find Transitive Closure

Recall that if there is a path of length at least one in R from a to b, then there is such a path with length not exceeding n. Thus,

$$R^* = R \cup R^2 \cup R^3 \cup \cdots \cup R^n.$$

**Theorem:** Let  $M_R$  be the zero-one matrix of the relation R on a set with n elements. Then the zero-one matrix of the transitive closure  $R^*$  is  $M_{R^*} = M_R \vee M_R^{[2]} \vee M_R^{[3]} \vee \cdots \vee M_R^{[n]},$ 

where  $M_R^{[n]} = \underbrace{M_R \odot M_R \odot \cdots \odot M_R}_{R}$ 

#### ALGORITHM 1 A Procedure for Computing the Transitive Closure. Hasse Diagram

Equivalence Relation

ove the loops (a, a) present at every vertex due to the reflexive

Remove all edges (x, y) for which there is an element  $z \in S$  s.t.  $x \prec z$  and  $z \prec y$ . These are the edges that must be prest the transitive property.

Arrange each edge so that its initial vertex is below the terminal

vertex. Remove all the arrows, because all edges point upwards toward their terminal vertex.

**Definition**: *a* is a maximal (resp. minimal) element in poset  $(S, \preccurlyeq)$  if there is no  $b \in S$  such that  $a \prec b$  (resp.  $b \prec a$ ).

**Example**: Which elements of the poset  $({2, 4, 5, 10, 12, 20, 25}, |)$  are

A poset can have more than one maximal element and more than the maximal element.

**Definition:** *a* is the greatest (resp. least) element of the poset  $(S, \preccurlyeq)$  if  $b \preccurlyeq a$  (resp.  $a \preccurlyeq b$ ) for all  $b \in S$ .

u ∈ S is called an upper bound (resp. lower bound) of A if a ≼ u (resp. u ≼ a) for all a ∈ A.

(top) is  $\varphi(p)$  for a  $Q \in X$  bound (resp. greatest lower bound) of  $A \in S$  is called the least upper bound (resp. lower bound) that is less than any other upper bounds (resp. lower bounds) of A. Find the greatest lower bound and the least upper bound of  $\{b, d, g\}$ , if

Definition: A partial ordered set in which every pair of elements has both a least upper bound and a greatest lower bound is called a lattice.

Every two elements of the second poset have both a least upper bound

• The least upper bound of two elements in this poset is the larger of the elements

• The greatest lower bound of two elements is the smaller of the elements

Find a compatible total ordering for the poset ({1,2,4,5,12,20},|).

20 12

 $1 \rightarrow 5 \rightarrow 2 \rightarrow 4 \rightarrow 20 \rightarrow 12$ 

Definition of a Graph Definition: A graph  $G = \{V, E\}$  consists of a nonempty set V of vertices (or nodes) and a set E of edges. Each edge has either one or two vertices associated with it, called its endpoints. An edge is said to be incident to

simple graph: A graph in which each edge connects two different vertices and where no two edges connect the same pair of vertices

Multigraph: Graphs that may have multiple edges connecting the

Pseudograph: Graphs that may include loops, and possibly multiple edges connecting the same pair of vertices or a vertex to itself.

directed graph (or digraph) (V, E) consists of a nonempty set of rtices V and a set of directed edges (or arcs) E. The directed edge sociated with the ordered pair (u, v) is said to start at u and end at v

associated with the ordered pair (u, v) is said to start a value for a Undirected Graphs Definition: Two vertices u, v in an undirected graph G are called adjacent (or neighbors) in G if there is an edge e between u and v. S an edge e is called incident with the vertices u and v and e is said to connect u and v.

**Definition**: The set of all neighbors of a vertex v of G = (V, E), denoted by N(v), is called the neighborhood of v.

If A is a subset of V, we denote by N(A) the set of all vertices in G that are adjacent to at least one vertex in A.

**Definition**: The degree of a vertex in an undirected graph is the number of edges incident with it, except that a loop at a vertex contributes two to the degree of that vertex. The degree of the vertex v is denoted by deg(v).

**Theorem** (Handshaking Theorem): If G = (V, E) is an undirected graph with *m* edges, then

 $2m = \sum_{v \in V} deg(v)$ 

(Note that this applies even if multiple edges and loops are present.)

Theorem: An undirected graph has an even number of vertices of odd

**Proof**: Let  $V_1$  be the vertices of even degrees and  $V_2$  be the vertices of

 $2m = \sum_{v \in V} \deg(v) = \sum_{v \in V_1} \deg(v) + \sum_{v \in V_2} \deg(v)$ 

**Definition**: An directed graph G = (V, E) consists of V, a nonempty set of vertices, and E, a set of directed edges.

Each edge is an ordered pair of vertices. The directed edge (u, v) is said to start at u and end at v.

Directed and Undirected Graph

20 12

20 12

nd v. Such

Maximal and Minimal Elements

maximal, and which are minimal?

The maximal elements are 12, 20, and 25

Greatest and Least Elements

Upper and Lower Bound

g is the least upper bound, b is the greatest lower bound

**Definition**: Let A be a subset of a poset  $(S, \preccurlyeq)$ .

they exist

Lattices

and a greatest lower bound

Hence, this second poset is a lattice Topological Sorting

This produces the total ordering

Lecture 17:

(or connect) its endpoints

same vertices

odd deg

Directed Graphs

Topological Sorting for Finite Posets

The minimal elements are 2 and 5.

vertex

procedure transitive closure ( $M_R$  : zero-one  $n \times n$  matrix)  $A := M_R$  $\begin{array}{l} \mathbf{A} := \mathbf{A} \mathbf{B} := \mathbf{A} \\ \mathbf{for} \ i := 2 \ \mathbf{to} \ n \\ \mathbf{A} := \mathbf{A} \odot \mathbf{M}_R \\ \mathbf{B} := \mathbf{B} \lor \mathbf{A} \\ \mathbf{return} \ \mathbf{B} \left[ \mathbf{B} \text{ is the zero-one matrix for } R^* \right] \end{array}$ 

# • n-1 Boolean products

• Each of these Boolean products use n<sup>2</sup>(2n-1) bit operations O(n<sup>4</sup>) bit operations.

# 16

**Definition**: A relation R on a set A is called an equivalence relation if it is eflexive, symmetric, and transitive Equivalence Class

**Definition:** Let R be an equivalence relation on a set A. The set of all elements that are related to an element a of A is called the equivalence class of a, denoted by  $[a]_R$ . When only one relation is considered, we use the notation [a].

 $[a]_R = \{b: (a,b) \in R\}$ 

**Theorem**: Let R be an equivalence relation on a set A. The following statements are equivalent: (i)*aRb* (ii) [*a*] = [*b*] (iii)  $[a] \cap [b] \neq \emptyset$ 

Partition of a Set  ${\it S}$ 

**Definition**: Let S be a set. A collection of nonempty subsets of S, i.e.  $A_1$ ,  $A_2$ , . . . ,  $A_k$ , is called a partition of S if:

 $A_i \cap A_j = \emptyset, i \neq j \text{ and } S = \bigcup_{i=1}^n A_i$ **Theorem:** Let R be an equivalence relation on a set A. Then, union of all the equivalence classes of R is A:

 $A = \bigcup [a]_R$ 

Theorem: The equivalence classes form a partition of A. **Theorem:** Let  $\{A_1, A_2, ..., A_i, ...\}$  be a partition of *S*. Then, there is an equivalence relation *R* on *S*, that has the sets  $A_i$  as its equivalence classes

# Partial Ordering

**Definition:** A relation R on a set S is called a partial ordering, or partial order, if it is reflexive, antisymmetric, and transi

A set S together with a partial ordering R is called a partially ordered or poset, denoted by (S, R). Members of S are called elements of the poset

 $S = \{1, 2, 3, 4, 5, 6\}, R$  denotes the "" relation • Is R reflexive? Yes

- Is R antisymmetric? Yes
- Is R transitive? Yes

Total Ordering

Well-Ordered Set

ordering), is a well-ordered set.

Partial Ordering

Comparable

Total Ordering

Well-ordered set

then P(v) is true.

 $a_2 \preccurlyeq_2 b_2$ 

discreet ≺ discrete

discreet ≺ discreetness

Comparability Determine whether the posets  $(\{1, 2, 3, 4, 5\}, |)$  and  $(\{1, 2, 4, 8, 16\}, |)$  are R is a partial ordering The notation  $a \preccurlyeq b$  is used to denote that  $(a, b) \in R$  in an arbitrary pose Solution: Because 2 and 3 have no upper bounds, they certainly do not have a least upper bound. Hence, the first poset is not a lattice. (S,R)

The notation  $a \prec b$  denotes that  $a \preccurlyeq b$ , but  $a \neq b$ .

**Example:**  $S = \{1, 2, 3, 4, 5, 6\}$ , R denotes the "|" relation. 2, 4 are comparable, 3, 5 are incomparable.

**Definition**: The elements *a* and *b* of a poset  $(S, \preccurlyeq)$  are comparable if either  $a \preccurlyeq b$  or  $b \preccurlyeq a$ . Otherwise, *a* and *b* are called incomparable.

Definition: If  $(S, \preccurlyeq)$  is a poset and every two elements of S are comparable, S is called a totally ordered or linearly ordered set, and  $\preccurlyeq$  is called a total order or a linear order. A totally ordered set is also called a chain.

**Example:**  $S = \{1, 2, 3, 4, 5, 6\}$ , R denotes the " $\geq$ " relation S is a chain

 $(S, \preccurlyeq)$  is a well-ordered set if it is a poset such that  $\preccurlyeq$  is a total ordering and every nonempty subset of S has a least element.

**Example**: The set of ordered pairs of positive integers,  $\mathbf{Z}^+ \times \mathbf{Z}^+$ , with  $(a_1, a_2), (b_1, b_2)$  if  $a_1 < b_1$ , or if  $a_1 = b_1$  and  $a_2 \leq b_2$  (the lexicographic

The set Z, with the usual  $\leq$  ordering, is not well-ordered because the set of negative integers, which is a subset of Z, has no least element.

if either a ≤ b or b ≤ a
e.g., S = {1,2,3,4,5,6}, R denotes the "|" relation: 2,4 are comparable, 3,5 are incomparable.

(S, ≺) is a poset and every two elements of S are comparable
 "≤" is a total order, "|" is not a totally order

total ordering; every nonempty subset of S has a least element

• e.g.,  $a \preccurlyeq b \preccurlyeq c...$ ; exists an a such that  $(a, b) \in R$  for all  $b \in S$ 

The Principle of Well-Ordered Induction: Suppose that  $(S, \preccurlyeq)$  is a well-ordered set. Then P(x) is true for all  $x \in S$ , if

Inductive Step: For every  $y \in S$ , if P(x) is true for all  $x \in S$  with  $x \prec y$ 

Note: Suppose  $x_0$  is the least element of a well ordered set, the inductive step tells us that  $P(x_0)$  is true. We do not need a basis step.

**Proof**: Suppose it is not the case that P(x) is true for all  $x \in S$ . Then there is an element  $y \in S$  such that P(y) is false.

Consequently, the set  $A=\{x\in S|P(x)\text{is false}\}$  is nonempty. Because S is well ordered, A has a least element a.

By the choice of a as a least element of A, we know that P(x) is true for all  $x \in S$  with  $x \prec a$ . By the inductive step, P(a) is true.

**Definition:** Given two posets  $(A_1, \preccurlyeq_1)$  and  $(A_2, \preccurlyeq_2)$ , the lexicographic ordering on  $A_1 \times A_2$  is defined by specifying that  $(a_1, a_2)$  is less than  $(b_1, b_2)$ , i.e.,  $(a_1, a_2) \preccurlyeq (b_1, b_2)$ , either if  $a_1 \prec_1 b_1$  or if  $a_1 = b_1$  then

Example: Consider strings of lowercase English letters. A lexicographic ordering can be defined using the ordering of the letters in the alphabet. This is the same ordering as that used in dictionaries.

This contradiction shows that P(x) must be true for all  $x \in S$ .

Lexicographic Ordering

reflexive, antisymmetric, and transitive.

The Principle of Well-Ordered Induction

• e.g.,  $\leq$ , |•  $a \preccurlyeq b$  denotes  $(a, b) \in R$  in a poset (S, R);  $(S, \preccurlyeq)$ 

### Directed Graphs

**Definition:** The in-degree of a vertex v, denoted by  $deg^-(v)$ , is the number of edges which terminate at v. The out-degree of v, denoted by  $deg^+(v)$ , is the number of edges with v as their initial vertex.

**Theorem**: Let G = (V, E) be a graph with directed edges. Then  $|F| = \sum deg(\tau_v) = \sum deg^+(v)$ 

A complete graph on *n* vertices, denoted by  $K_n$ , is the simple graph that contains exactly one edge between each pair of distinct vertices ||

$$\vdots \longrightarrow A$$
  $\boxtimes A$   $\bigoplus A$ 

A cycle  $C_n$  for  $n \ge 3$  consists of n vertices  $v_1, v_2, \ldots, v_n$ , and edges  $\{v_1, v_2\} = \{v_2, v_3\} = \{v_{n-1}, v_n\} = \{v_n, v_1\}$ 

$$\bigwedge_{c_3} \prod_{c_4} \bigcap_{c_5} \bigwedge_{c_6}$$

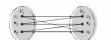
Wheels  $W_n$  is obtained by adding an additional vertex to a cycle  $C_n$ 

N-dimensional Hypercube

An *n*-dimensional hypercube or *n*-cube,  $Q_n$  is a graph with  $2^n$  vertices representing all bit strings of length *n*, where there is an edge between vertices that differ in exactly one bit position 10

**Definition** A simple graph G is bipartite if V can be partitioned into disjoint subsets  $V_1$  and  $V_2$  such that every edge connects a vertex in and a vertex in  $V_2$ 

An equivalent definition of a bipartite graph is a graph where it is possible to color the vertices red or blue so that no two adjacent vertices are of the same color



### **Complete Bipartite Graphs**

**Definition:** A complete bipartite graph  $K_{m,n}$  is a graph that has its verset partitioned into two subsets  $V_1$  of size *m* and  $V_2$  of size *n* such that there is an edge from every vertex in  $V_1$  to every vertex in  $V_{2,i}$ . re is an edge from every vertex in  $V_1$  to every vertex in  $V_2$ .

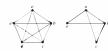


#### Bipartite Graphs and Matchings

**Theorem** (Hall's Marriage Theorem) The bipartite graph G = (V, E) with bipartition  $(V_1, V_2)$  has a complete matching from  $V_1$  to  $V_2$  if and only if  $|N(A)| \ge |A|$  for all subsets A of  $V_1$ 

# Subgraphs

**Definition:** A subgraph of a graph G = (V, E) is a graph (W, F) where  $W \subseteq V$  and  $F \subseteq E$ . A subgraph H of G is a proper subgraph of G if  $H \neq G$ 



#### Union of Graphs

**Definition**: The union of two simple graphs  $G_1 = (V_1, E_1)$  and  $G_2 = (V_2, E_2)$  is the simple graph with vertex set  $V_1 \cup V_2$  and edge set  $E_1 \cup E_2$  denoted by  $G_1 \cup G_2$ 



### Lecture 18 些定义和记号

• 如果两个顶点之间存在边,那么这两个顶点是adjacent的或者说是

- N(v): 如果v是G = (V, E)中的一个顶点,那么N(v)是与v相邻的顶
- 点的集合。 N(A): 如果A是G = (V, E)的一个子集,那么N(A)是与A中的顶点
- 相邻的顶点的集合。 deg(v): 无向图的degree是指与v相邻的顶点的个数,但是一个环对 degree的贡献是2。

### Theorem (Handshaking Theorem)

If G = (V, E) is an **undirected** graph with m edges, then

$$2m = \sum_{v \in V} deg(v)$$

如果一个无向图有m条边,那么这个图中所有顶点的度数之和为2m(即使是有多重边或自环的图)。

### Theorem

An undirected graph has an even number of vertices of odd degree. 一个无向图中,度数为奇数的顶点的个数为偶数。 证明

假设Vadd是所有度数为奇数的顶点的集合,Veven是所有度数为偶数的顶 点的集合,那么

$$2m = \sum_{v \in V} deg(v) = \sum_{v \in V_{odd}} deg(v) + \sum_{v \in V_{odd}} deg(v)$$

由于2m是偶数,  $\sum_{v \in V_{enco}} deg(v)$ 也是偶数, 所以 $\sum_{v \in V_{edd}} deg(v)$ 必须也是 偶数,而∑<sub>i=eV<sub>i</sub>a</sub> deq(v)是所有度数为奇数的顶点的度数之和,所以度数 为奇数的顶点的个数为偶数。

# Isomorphism of Graphs (同构)

**Directed Graph** 

一些定义和记号

Theorem

out-degree之和。

edges.

地,如果 $|M| = |V_1|$ 。

图的表示

• adjacency list (邻接表)

• adjacency matrix (邻接矩阵)

• incidence matrix (关联矩阵)

Adjacency Matrix (邻接矩阵)

有环或多重边的图的邻接矩阵

阵。aij的值是vi和vj之间的边的条数。

Incidence Matrix (关联矩阵)

 $M = [m_{ij}]$  ,

定义:假设G = (V, E)是一个无向图,顶点 $v_1, v_2, \cdots, v_n$ ,边

 $e_1, e_2, \cdots, e_m$ 。 G的incidence matrix  $M_G$ 是一个n imes m的O-I矩阵

 $m_{ij} = egin{cases} 1 & ext{if } e_j ext{ is incident with } v_i \ 0 & ext{otherwise} \end{cases}$ 

Adjacency List (邻接表)

定了每个顶点的邻接顶点。

简单图的邻接矩阵

 $v_1, v_2, \cdots, v_n$  Ghadja

的时候,  $A_G$ 的(i, j)位置是o。

adjacent to v, v是terminal vertex并且adjacent from u

 $|E| = \sum deg^-(v) = \sum deg^+(v)$ 

有向图的边的条数等于所有顶点的in-degree之和,也等于所有顶点的

Matching是指把一个集合中的元素和另一个集合中的元素匹配起来。

-个matching是边集的一个子集,使得任意两条边都不与同一个顶点

关联。换句话说,一个matching是边集的一个子集,使得如果 $\{s,t\}$ 和

Job assignments:顶点代表工作和员工,边连接员工和他们被训练过 的工作。一个常见的目标是把工作分配给员工,使得完成的工作最多。

A matching M in a bipartite graph G = (V, E) with bipartition  $(V_1, V_2)$ 

A maximum matching is a matching with the largest number of

。 个**maximum matching**是一个**matching**,它的边数最多。

is a complete matching from  $V_1$  to  $V_2$  if every vertex in  $V_1$  is the

endpoint of an edge in the matching, or equivalently, if  $|M| = |V_1|$ .

一个matching M是一个complete matching,如果M是从Vi到Vi的 matching,并且Vi中的每个顶点都是M中一条边的端点,或者等价

**Theorem (Hall's Marriage Theorem)**: The bipartite graph G = (V, E)

with bipartition  $(V_1, V_2)$  has a complete matching from  $V_1$  to  $V_2$  if and only if  $|N(A)| \ge |A|$  for all subsets A of  $V_1$ .

Hall's Marriage Theorem:如果一个二分图G = (V, E),它的顶点集被划分为两个子集Vt和 $V_2$ ,那么G有一个从Vt到 $V_2$ 的complete

定义:adjacency list (邻接表)可以用来表示一个<mark>没有重复边</mark>的图,它指

当 $v_i$ 和 $v_j$ 是adjacent的时候,  $A_G$ 的(i, j)位置是I, 当 $v_i$ 和 $v_j$ 不是adjacent

 $A_G = [a_{ij}]$ , where

 $a_{ij} = \begin{cases} 1 & \text{if } v_i \text{ and } v_j \text{ are adjacent} \\ 0 & \text{if } v_i \text{ and } v_j \text{ are not adjacent} \end{cases}$ 

邻接矩阵也可以用来表示<mark>有环或多重边的图</mark>。邻接矩阵不再是o-I矩

 $cency matrix A_G$ 是一个 $n \times n$ 的o-I矩阵,

0

1

1

0 3 0  $\mathbf{2}$ 

 $\mathbf{3}$ 0 1 1

0

 $\mathbf{2}$ 

1

0

1 1 1

0 1 1

0 0 0 0

1 0 1 0 0 0

0 0

0 0 0 1

0 0 1

1

matching,当且仅当对于 $V_1$ 的任意子集A,  $|N(A)| \ge |A|_{\circ}$ 

deg<sup>-</sup>(v): in-degree of v, 指向v的边的条数

环对in-degree和out-degree的贡献都是I

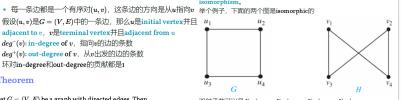
**Bipartite Graphs and Matchings** 

{u,v}是matching的两条边,那么s,t,u,v都是不同的。

 $deg^+(v)$ : out-degree of v, 从v出发的边的条数

Let G = (V, E) be a graph with directed edges. Then,

orphic的,如果存在 定义:简单图 $G_1 = (V_1, E_1)$ 和 $G_2 = (V_2, E_2)$ 是iso 一个从 $V_1$ 到 $V_2$ 的双射,并且满足对于 $V_1$ 中的任意两个顶点a和b是 adjacent的当目仅当f(a)和f(b)是adjacent的。这样的函数f被称为



双射函数可以是 $f(u_1) = v_1, f(u_2) = v_4, f(u_3) = v_3, f(u_4) = v_2$ 。 至此,我们来总结一下几个isomorphic invariants

- number of vertices (顶点的个数) number of edges (边的条数)
- degree sequence (度数序列)
- existence of simple circuits of various lengths (长度为k的simple) circuit的存在)

# Path: Undirected Graph

Definition: Let n be a nonnegative integer and G an undirected graph. A path of length n from u to v in G is a sequence of n edges  $e_1, e_2, \dots, e_n$  of G for which there exists a sequence

 $x_0 = u, x_1, \cdots, x_{n-1}, x_n = v$  of vertices such that  $e_i$  has the endpoints  $x_{i-1}$  and  $x_i$  for  $i = 1, \cdots, n$ . 定义: n是一个非负整数, G是一个无向图。G中从u到v的长度为 path是一个边的序列 $e_1, e_2, \dots, e_n$ ,满足存在一个顶点的序列 $x_0 = u, x_1, \dots, x_{n-1}, x_n = v$ ,使得 $e_i$ 的端点是 $x_{i-1}$ 和 $x_i$ ,  $i = 1, \dots, n$ 。

一个path被称作circuit或cycle,如果它的起点和终点是同一个顶点。 但长度大于o

一个path或者circuit是simple的,如果它不包含重复的edge。

path的长度=path里面的边的条数

### Path: Directed Graph

Definition: Let n be a nonnegative integer and G an directed graph. A th of length n from u to v in G is a sequence of n edges  $e_1, e_2, \cdots$ of G for which there exists a sequence  $x_0 = u, x_1, \cdots, x_{n-1}, x_n = v$  of vertices such that  $e_i$  is associated with initial vertex  $x_{i-1}$  and terminal vertex  $x_i$  for  $i = 1, \cdots, n$ . 定义: n是一个非负整数, G是一个有向图。G中从u到v的长度为n的 path是一个边的序列 $e_1, e_2, \cdots, e_n$ ,满足存在一个顶点的序列 $x_0 = u, x_1, \cdots, x_{n-1}, x_n = v$ , 使得 $e_i$ 的initial vertex是 $x_{i-1}$ , terminal vertex  $\nexists x_i, i = 1, \cdots, n_o$ 

## cvcle和simple path的定义和无向图中的一样。

Connectivity 一个无向图是connected的,如果图中任意两个不同的顶点之间都存在 个不是connected的无向图是disconnected的。

Lemma: 如果图G中两个不同的顶点x和y之间存在一条路径,那么G中x 和y之间存在一条simple path。

#### Proof 删除里面的circuit即可。

一个connected的无向图中任意两个不同的顶点之间都存在 -条simple path。

定义:假设G = (V, E)是一个简单图,|V| = n。任意地把G的顶点列出 个图G的connected component是一个connected的子图,它不是G 的另一个connected的子图的proper subgraph。 也就是说, connected component要满足两个条件

> 连通性:它是connected的 最大性:这个子图是最大的连通子图,意味着它不是另一个更大的 连通子图的真子图(即,不是另一个连通子图的一部分)

**Connectedness in Directed Graphs** 

### 定义

1

 $0 \ 1 \ 0$ 

1 2

20

0 0 0 0

0 0 0 0 0

 $\begin{array}{c} 0 \\ 1 \end{array}$ 

0 0 0 0 1 1

 $0 \ 1$ 

0

 $\begin{array}{c} 0 \\ 0 \end{array}$  $\begin{array}{c} 1 \\ 0 \end{array}$  $\begin{array}{c} 1 \\ 0 \end{array}$ 

 $1 \ 1 \ 0 \ 0$ 

0 0 0

一个有向图是strongly connected的,如果对于图中的任意两个顶 点a和b, a到b有一条path, b到a也有一条path。 • 一个有向图是weakly connected的,如果它的underlying undirected graph是connected的。

# Cut Vertices and Cut Edges

 $K_{mn}$ 的色数是2。 Sometimes the removal from a graph of a vertex and all incident edges C,的色数是2(当n是偶数的时候)或者3(当n是奇数的时候)。 disconnect the graph. Trees Such vertices are called cut vertices. Similarly we may define cut edges 定义: 一个tree是一个connected的无向图, 它没有simple circuit。 Theorem: 一个无向图是一个tree, 当且仅当它的任意两个顶点之间都

有时候,从一个图中删除一个顶点和所有与它关联的边会使得图不再是 onnected的。这样的顶点被称为cut vertices。类似地,我们也可以定 义cut edges。 个图G的edge connectivity  $\lambda(G)$ 是一个edge cut中边的最小条数.

就是最少需要删除多少条边,才能使得图不再是connected的。这个数 值就是edge connectivity.

**Counting Paths between Vertices** 

Theorem: 假设G是一个图,A是G的adjacency matrix,顶点的顺序是  $v_1, v_2, \cdots, v_n$ 。从 $v_i$ 到 $v_j$ 的长度为r的不同的path的个数,其中r是一个正 整数,等于 $A^{r}$ 的(i, j)位置的值。

# **Euler Paths and Circuits**

Ko'nigsberg seven-bridge problem:有人想知道是否可以从城镇 的某个位置出发,穿过所有的桥一次而不重复,然后回到起点。

定义:一个图G中的Euler circuit是一个包含G中所有边的simple circuit。一个图G中的Euler path是一个包含G中所有边的simple path.

# **Necessary Conditions for Euler Circuits and Paths**

• Fuler Circuit: 每个顶占的度数都早偶数 Euler Path:除了两个顶点的度数是奇数,其他顶点的度数都是偶 数。这条path的起点和终点是这两个度数为奇数的顶点。 定义: 一个rooted tree中顶点v的level是指从root到v的唯一的path的长 度。 ~。 一个rooted tree的height是指它的顶点的level的最大值。 Balanced m-ary Trees: 一个高度为h的rooted m-ary tree是bala的,如果所有的leaves都在level h或h - 1。

**Theorem**: 一个高度为h的rooted m-ary tree最多有m<sup>h</sup>个leaves。 **Corollary**: 如果一个高度为h的rooted m-ary tree有l个leaves,那么  $h \geq \lceil \log_m l \rceil$ 。如果这个m-ary tree是full和balanced的,那么  $h = \lceil \log_m l \rceil_{\circ}$ 

# Hamilton Paths and Circuits

Euler path是每个边都只经过一次 Hamilton path是每个顶点都只经过一次

Necessary Conditions for Hamilton Circuits and Paths

# 没有已知的充要条件可以判断存在Hamilton circuit或path。

但是有一些sufficient conditions

- Dirac's Theorem: 如果G是一个简单图,  $|V| \ge 3$ , 并且G中每个顶 点的度数都大于等于 $\frac{|V|}{2}$ ,那么G有一个Hamilton circuit。 Ore's Theorem:如果G是一个简单图, $|V| \ge 3$ ,并且对于G中的任 意两个不相邻的顶点u和v, u和v的度数之和都大于等于IVI, 那么
- G有一个Hamilton circuit。 例子:证明K<sub>n</sub>有Hamilton circuit
- Hamilton path问题是NP-completez-的

#### **Planar Graphs** Definition: A graph is called planar if it can be drawn in the plane

ithout any edges crossing. Such a drawing is called a planar presentation of the graph. 定义:如果一个图可以在平面上画出来,而且没有边相交,那么这个图

是planar的。这样的画法被称为这个图的planar 关于怎么找planar representation,可以试试先画一个闭合的多边形, 然后再把剩下的顶点一个一个加进去

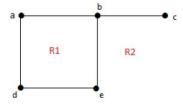
Euler's Formula

个图的planar representation把平面分成了一些区域,包括一个无界 区域。

Theorem (Euler's Formula): 假设G是一个connected的planar simple graph, e是边的条数, v是顶点的个数, r是G的planar representation 中的区域的个数。那么,r = e - v + 2。

### The Degree of Regions

定义:一个region的degree是指这个region的边的条数。当一个边在边 界上出现两次的时候,它对degree的贡献是2. 例2: 上面那个比较正常,我们看个抽象的:



### degree of region I = 4

degree of region 2 = 6 (这里bc被计算了两次) Corollary

Corollary 3

Four-color theorem

**Chromatic number** 

记号: $\chi(G)$ 表示图G的色数。

有唯一的simple path。

边都是从root指向其他顶点的。

当u是v的parent的时候, v被称为u的child。

一个rooted tree的顶点被称为leaf,如果它没有child。 有child的顶点被称为internal vertices。

顶点w的descendants是指w的祖先,

descendants关联的边。

vertices  $\exists l = \frac{(m-1)n+1}{m} \uparrow leaves_0$ 

顶点和l = (m - 1)i + 1个leaves,

 $i = \frac{l-1}{m-1}$   $\uparrow$  internal vertices.

**Rooted Trees** 

↑rooted tree

方向。

root.

顶点.

 $K_n$ 的色数是n。

使得任意两个相邻的区域的颜色不同。

根据Four-color theorem, 平面图的色数不超过4。

如果G是一个connected的planar simple graph, e是边的条数, v是顶 点的个数,  $v \ge 3$ , 那么 $e \le 3v - 6$ 。 orollary 2

### 如果G是一个connected的planar simple graph,那么G有一个顶点的度 数不超过**5**

如果G是一个connected的planar simple graph,e是边的条数,v是顶

点的个数,  $v \ge 3$ , 并且G中没有长度为3的circuit, 那么 $e \le 2v - 4$ 。

Four-color theorem: 给定一个平面,把它分成一些连续的区域,产生

个叫做map的图形,最多只需要四种颜色来给map中的区域染色,

。 色数是指给图中的顶点染色,使得相邻的顶点颜色不同,所需的最少颜

定义:一个**rooted tree**是一个t**ree**,其中一个顶点被指定为**root**,每条

我们可以通过选择任意一个顶点作为root,把一个unrooted tree变成-

在一个rooted tree中,边的方向可以省略,因为root的选择决定了边的

定义:顶点v的parent是指唯一的顶点u,使得u到v有一条有向边。

有相同**parent**的顶点被称为<mark>siblings。</mark> 顶点v的ancestors是指从root到v的路径上的顶点,不包括v,包括

以a为root的subtree包括a和a的descendants 以及所有与这些

定义:如果一个rooted tree的每个internal vertex都有不超过m个

特别地,如果m = 2,那么这个rooted tree被称为binary tree。 Cheorem: 一个有n个顶点的tree有n - 1条边。

children,那么这个rooted tree被称为m-ary tree。如果每个internal vertex都有m个children,那么这个rooted tree被称为mary tree。如果每个internal vertex都有m个children,那么这个rooted tree被称为full m-ary tree。

个有i个有i个internal vertices的full m-ary tree有n = mi + 1个

个有n个顶点的full m-ary tree有 $i = \frac{n-1}{m}$ 个internal

一个有i个internal vertices的full m-ary tree有n = mi + 1个

个有l个leaves的full m-ary tree有 $n = \frac{ml-1}{m-1}$ 个顶点和