

# Lecture 15

## n-ary Relations

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

- The sets  $A_1, \dots, A_n$  are called the **domains** of *R*.
- The **degree** of *R* is *n*.
- R* is functional in domain  $A_i$  if it contains at **most one** *n*-tuple  $(\dots, a_i, \dots)$  for any value  $a_i$  within domain  $A_i$ .

### Transitive Relation and $R^n$

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

- 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.
    - $n = 1$ :  $R^1 \subseteq R$
    - Suppose  $R^k \subseteq R$ :
      - $(a, c) \in R^{k+1} \iff R^k \circ R$ : there is a  $b \in A$  such that  $(a, b) \in R$  and  $(b, c) \in R^k$
      - Since  $R^k$  is transitive,  $(a, b) \in R$  and  $(b, c) \in R^k \subseteq R$  implies that  $(a, c) \in R$

### Relational Databases

A domain  $A_i$  is a **primary key** for the database if the relation *R* is functional in  $A_i$ .

| 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 |

a composite key for the *n*-ary relation, assuming that no *n*-tuples are ever

### Selection Operator

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

The **selection operator**  $\sigma_C$  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*.

$$\forall R \subseteq A, \sigma_C(R) = R \cap \{a \in A \mid \sigma_C(a) = T\} = \{a \in R \mid \sigma_C(a) = T\}$$

### Selection Operator: Example

Suppose that we have a domain

$$A = \text{StudentName} \times \text{Standing} \times \text{SoCSecNos}$$

Suppose that we have a condition

$$\text{UpperLevel}(\text{name}, \text{standing}, \text{ssn})$$

**Projection Operator**  $\pi := \{(standing = junior) \vee (standing = senior)\}$

Let  $A = A_1 \times \dots \times A_n$  be any *n*-ary domain, and let  $\{i_k\} = \{i_1, \dots, i_m\}$  be a sequence of indices all falling in the range 1 to *n*. That is, where  $1 \leq i_k \leq n$  for all  $1 \leq k \leq m$ .

Then the **projection operator** on *n*-tuples  $P_{i_k}: A \rightarrow A_{i_1} \times \dots \times A_{i_m}$  is defined by  $P_{i_k}(a_1, \dots, a_n) = (a_{i_1}, \dots, a_{i_m})$

Example  $P_{1,2}$

| Student | Major            | Course |
|---------|------------------|--------|
| Glauser | Biology          | BI 290 |
| Glauser | Biology          | MS 475 |
| Glauser | Biology          | PY 410 |
| Marcus  | Mathematics      | MS 511 |
| Marcus  | Mathematics      | MS 603 |
| Marcus  | Mathematics      | CS 322 |
| Miller  | Computer Science | MS 575 |
| Miller  | Computer Science | CS 455 |

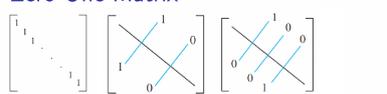
| Student | Major            |
|---------|------------------|
| Glauser | Biology          |
| Marcus  | Mathematics      |
| Miller  | Computer Science |

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

| Professor | Department       | Course_number | Department       | Course_number | Room | Time       |
|-----------|------------------|---------------|------------------|---------------|------|------------|
| Crüz      | Zoology          | 335           | Computer Science | 518           | NS21 | 2:00 P.M.  |
| Crüz      | Zoology          | 412           | Mathematics      | 575           | NS02 | 3:00 P.M.  |
| Farber    | Psychology       | 501           | Mathematics      | 611           | NS21 | 4:00 P.M.  |
| Farber    | Psychology       | 617           | Physics          | 544           | B505 | 4:00 P.M.  |
| Grammer   | Physics          | 544           | Psychology       | 501           | A100 | 3:00 P.M.  |
| Grammer   | Physics          | 544           | Psychology       | 617           | A110 | 11:00 A.M. |
| Rosen     | Computer Science | 518           | Zoology          | 335           | A100 | 4:00 A.M.  |
| Rosen     | Mathematics      | 575           | Zoology          | 412           | A100 | 4:00 A.M.  |

| Professor | Department       | Course_number | Room | Time       |
|-----------|------------------|---------------|------|------------|
| Crüz      | Zoology          | 335           | A100 | 9:00 A.M.  |
| Crüz      | Zoology          | 412           | A100 | 8:00 A.M.  |
| Farber    | Psychology       | 501           | A100 | 3:00 P.M.  |
| Farber    | Psychology       | 617           | A110 | 11:00 A.M. |
| Grammer   | Physics          | 544           | B505 | 4:00 P.M.  |
| Rosen     | Computer Science | 518           | NS21 | 2:00 P.M.  |
| Rosen     | Mathematics      | 575           | NS02 | 3:00 P.M.  |

### Zero-One Matrix



Reflexive    Symmetric    Antisymmetric

### Join and Meet

Let  $A = [a_{ij}]$  and  $B = [b_{ij}]$  be  $m \times n$  zero-one matrices.

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

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  $A \wedge B$ .

$$MR_1 \cup R_2 = MR_1 \vee MR_2$$

$$MR_1 \cap R_2 = MR_1 \wedge MR_2$$

### 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  $m \times n$  matrix with  $(i, j)$ -th entry  $c_{ij}$  where

$$c_{ij} = (a_{i1} \wedge b_{1j}) \vee (a_{i2} \wedge b_{2j}) \vee \dots \vee (a_{ik} \wedge b_{kj})$$

$$A = \begin{bmatrix} 1 & 0 \\ 0 & 1 \\ 1 & 0 \end{bmatrix}, \quad B = \begin{bmatrix} 1 & 1 & 0 \\ 0 & 1 & 1 \\ 1 & 1 & 0 \end{bmatrix}$$

$$A \odot B = \begin{bmatrix} 1 & 1 & 0 \\ 0 & 1 & 1 \\ 1 & 1 & 0 \end{bmatrix}$$

$$M_{S \circ R} = M_R \circ M_S$$

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*.

$$M_R = \begin{bmatrix} 1 & 0 & 1 \\ 1 & 1 & 0 \\ 0 & 0 & 0 \end{bmatrix} \quad \text{and} \quad M_S = \begin{bmatrix} 0 & 1 & 0 \\ 0 & 0 & 1 \\ 1 & 0 & 1 \end{bmatrix}$$

$$M_{S \circ R} = M_R \circ M_S = \begin{bmatrix} 1 & 1 & 1 \\ 0 & 1 & 1 \\ 0 & 0 & 0 \end{bmatrix}$$

### 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 the **minimal 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:

- reflexive
- symmetric
- transitive
- reflexive closures
- 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  $(x_0, x_1), (x_1, x_2), \dots, (x_{n-1}, x_n)$  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 **circuit** or **cycle**.

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

### 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*:

$$R^* = \bigcup_{k=1}^{\infty} R^k$$

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

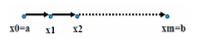
$$R = \{(1, 2), (1, 3), (1, 4), (2, 3), (3, 4)\}, \quad R^2 = \{(1, 3), (2, 4), (1, 4)\}$$

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

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

**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



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

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

There is a circuit that can be deleted until the length is  $< n$ .

**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  $\leq n - 1$ .

**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  $n \geq 1$ . (Recall  $S \subseteq S$  containing iff  $S^n \subseteq S$ .)
  - 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,

$$R^* = R \cup R^2 \cup R^3 \cup \dots \cup R^n$$

**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

$$M_{R^*} = M_R \vee M_R^2 \vee M_R^3 \vee \dots \vee M_R^n$$

$$\text{where } M_{R^*} = \bigcup_{i=1}^n M_{R^i}$$

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

```

procedure transitive closure (MR : zero-one n × n matrix)
A := MR
B := A
for i := 2 to n
    A := A ∘ MR
    B := B ∨ A
return B
B is the zero-one matrix for R*
    
```

- $n - 1$  Boolean products
- Each of these Boolean products uses  $n^2(2n - 1)$  bit operations.
- $O(n^3)$  bit operations.

## 16

### Equivalence Relation

**Definition:** A relation *R* on a set *A* is called an **equivalence relation** if it is reflexive, 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 *S*

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

$$A_i \cap A_j = \emptyset, i \neq j \text{ and } S = \bigcup_{i=1}^k A_i$$

**Theorem:** Let *R* be an equivalence relation on a set *A*. Then, union of all the equivalence classes of *R* is *A*:

$$A = \bigcup_{a \in A} [a]_R$$

**Theorem:** The equivalence classes form a partition of *A*.

**Theorem:** Let  $\{A_1, A_2, \dots, A_k, \dots\}$  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 transitive.

A set *S* together with a partial ordering *R* is called a **partially ordered set**, 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 " $\leq$ " relation

- Is *R* reflexive? Yes
- Is *R* antisymmetric? Yes
- Is *R* transitive? Yes

*R* is a partial ordering

The notation  $a \leq b$  is used to denote that  $(a, b) \in R$  in an arbitrary poset  $(S, R)$ .

The notation  $a < b$  denotes that  $a \leq b$ , but  $a \neq b$ .

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

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

### Total Ordering

**Definition:** If  $(S, \leq)$  is a poset and every two elements of *S* are comparable, *S* is called a **totally ordered** or linearly ordered set, and  $\leq$  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.

### Directed Graphs

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

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

$$|E| = \sum_{v \in V} \text{deg}^-(v) = \sum_{v \in V} \text{deg}^+(v)$$

### Complete Graphs

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

### Cycles

A **cycle**  $C_n$  for  $n \geq 3$  consists of  $n$  vertices  $v_1, v_2, \dots, v_n$ , and edges  $\{v_1, v_2\}, \{v_2, v_3\}, \dots, \{v_{n-1}, v_n\}, \{v_n, v_1\}$

### Wheels

A **wheel**  $W_n$  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 two vertices that **differ in exactly one bit position**.

### Bipartite Graphs

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

### 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  $|N(A)| \geq |A|$  for all subsets  $A$  of  $V_1$ .

**Subgraphs**

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

#### 一些定义和记号

- 如果两个顶点之间存在边, 那么这两个顶点是**adjacent**的或者说是有**neighbors**
- $N(v)$ : 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。
- $\text{deg}(v)$ : 无向图的**degree**是指与 $v$ 相邻的顶点的个数, 但是一个环对 $\text{deg}$ 的贡献是2。

### Theorem (Handshaking Theorem)

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

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

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 $V_{\text{odd}}$ 是所有度数为奇数的顶点的集合,  $V_{\text{even}}$ 是所有度数为偶数的顶点的集合, 那么

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

由于 $2m$ 是偶数,  $\sum_{v \in V_{\text{even}}} \text{deg}(v)$ 也是偶数, 所以 $\sum_{v \in V_{\text{odd}}} \text{deg}(v)$ 必须也是偶数, 而 $\sum_{v \in V_{\text{odd}}} \text{deg}(v)$ 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。

### Directed Graph

#### 一些定义和记号

- 每一条边都是一个有序对 $(u, v)$ , 这条边的方向是从 $u$ 指向 $v$
- 假设 $(u, v)$ 是 $G = (V, E)$ 中的一条边, 那么 $u$ 是**initial vertex**并且**adjacent to  $v$** ,  $v$ 是**terminal vertex**并且**adjacent from  $u$**
- $\text{deg}^-(v)$ : **in-degree** of  $v$ , 指向 $v$ 的边的条数
- $\text{deg}^+(v)$ : **out-degree** of  $v$ , 从 $v$ 出发的边的条数
- 环对**in-degree**和**out-degree**的贡献都是1

### Theorem

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

$$|E| = \sum_{v \in V} \text{deg}^-(v) = \sum_{v \in V} \text{deg}^+(v)$$

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**out-degree**之和。

### Bipartite Graphs and Matchings

**Matching**是指把一个集中的元素和另一个集中的元素匹配起来。一个**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 $\{u, v\}$ 是**matching**的两条边, 那么 $s, t, u, v$ 都是不同的。

**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 **maximum matching** is a matching with the **largest number of edges**. 一个**maximum matching**是一个**matching**, 它的边数最多。

A matching  $M$  in a bipartite graph  $G = (V, E)$  with bipartition  $(V_1, V_2)$  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 $V_1$ 到 $V_2$ 的**matching**, 并且 $V_1$ 中的每个顶点都是 $M$ 中一条边的端点, 或者等价地, 如果 $|M| = |V_1|$ 。

**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  $|N(A)| \geq |A|$  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 $V_1$ 和 $V_2$ , 那么 $G$ 有一个从 $V_1$ 到 $V_2$ 的**complete matching**, 当且仅当对于 $V_1$ 的任意子集 $A$ ,  $|N(A)| \geq |A|$ 。

### 图

- adjacency list (邻接表)
- adjacency matrix (邻接矩阵)
- incidence matrix (关联矩阵)

### Adjacency List (邻接表)

**定义:** adjacency list (邻接表)可以用来表示一个**没有重复边**的图, 它指定了每个顶点的邻接顶点。

### Adjacency Matrix (邻接矩阵)

### 简单图的邻接矩阵

**定义:** 假设 $G = (V, E)$ 是一个**简单图**,  $|V| = n$ . 任意地把 $G$ 的顶点列出来,  $v_1, v_2, \dots, v_n$ .  $G$ 的**adjacency matrix**  $A_G$ 是一个 $n \times n$ 的0-1矩阵, 当 $v_i$ 和 $v_j$ 是**adjacent**的时候,  $A_G$ 的 $(i, j)$ 位置是1; 当 $v_i$ 和 $v_j$ 不是**adjacent**的时候,  $A_G$ 的 $(i, j)$ 位置是0。

$$A_G = [a_{ij}]_{i,j}$$

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

### 有环或多重边的图的邻接矩阵

邻接矩阵也可以用来表示**有环或多重边**的图。邻接矩阵不再是0-1矩阵,  $a_{ij}$ 的值是 $v_i$ 和 $v_j$ 之间的边的条数。

### Incidence Matrix (关联矩阵)

**定义:** 假设 $G = (V, E)$ 是一个**无向图**, 顶点 $v_1, v_2, \dots, v_n$ , 边 $e_1, e_2, \dots, e_m$ .  $G$ 的**incidence matrix**  $M_G$ 是一个 $n \times m$ 的0-1矩阵  $M = [m_{ij}]$ ,

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

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### Isomorphism of Graphs (同构)

**定义:** 简单图 $G_1 = (V_1, E_1)$ 和 $G_2 = (V_2, E_2)$ 是**isomorphic**的, 如果存在一个从 $V_1$ 到 $V_2$ 的**双射**, 并且满足对于 $V_1$ 中的任意两个顶点 $a$ 和 $b$ ,  $a$ 和 $b$ 是**adjacent**的当且仅当 $f(a)$ 和 $f(b)$ 是**adjacent**的。这样的函数 $f$ 被称为**isomorphism**。

举个例子, 下面的两个图是**isomorphic**的

双射函数可以是 $f(u_1) = v_1, f(u_2) = v_2, f(u_3) = v_3, f(u_4) = v_4$ 。

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 $n$ 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  $x_0 = u, x_1, \dots, x_n = v$  of vertices such that  $e_i$  has the endpoints  $x_{i-1}$  and  $x_i$  for  $i = 1, \dots, n$ .

**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 $n$ 的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0。

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 **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  $x_0 = u, x_1, \dots, x_n = v$  of vertices such that  $e_i$  is associated with initial vertex  $x_{i-1}$  and terminal vertex  $x_i$  for  $i = 1, \dots, n$ .

**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 $e_1, e_2, \dots, e_n$ , 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**initial vertex**是 $x_{i-1}$ , **terminal vertex**是 $x_i$ ,  $i = 1, \dots, n$ .

**cycle**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一条路径。

一个不是**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:** 删除路上的**circuit**即可。

**Theorem:** 一个**connected**的无向图中任意两个不同的顶点之间都存在一条**simple path**.

一个图 $G$ 的**connected component**是一个**connected**的子图, 它是 $G$ 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:**

- 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

Sometimes the removal from a graph of a vertex and all incident edges **disconnect** the graph. Such vertices are called **cut vertices**. Similarly we may define **cut edges**. 有时候, 从一个图中删除一个顶点和所有与其关联的边会使图不再是**connected**的。这样的顶点被称为**cut vertices**。类似地, 我们也可以定义**cut edges**。

一个图 $G$ 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, 才能使图不再是**connected**的。这个数就是**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 $v_1, v_2, \dots, v_n$ . 从 $v_i$ 到 $v_j$ 的长度为 $k$ 的不同的**path**的个数, 其中 $k$ 是一个正整数, 等于 $A^k$ 的 $(i, j)$ 位置的值。

### Euler Paths and Circuits

引入: **Ko'nigsberg seven-bridge problem:** 有人想知道是否可以从小镇桥的某个位置出发, 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**。

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

### Necessary Conditions for Euler Circuits and Paths

- Euler Circuit:** 每个顶点的度数都是偶数
- 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**中顶点的**level**是指从root到 $u$ 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**balanced**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 $m^h$ 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 $h = \lceil \log_m l \rceil$ 。

### Euler path

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是否存在Hamilton circuit或path, 但是有一些**sufficient conditions**:

- Dirac's Theorem:** 如果 $G$ 是一个简单图,  $|V| \geq 3$ , 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,  $|V| \geq 3$ , 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 $|V|$ , 那么 $G$ 有一个**Hamilton circuit**。

例子: 证明 $K_n$ 有Hamilton circuit

Hamilton path问题是NP-complete的

### Planar Graphs

**Definition:** A graph is called **planar** if it can be drawn in the **plane without any edges crossing**. Such a drawing is called a **planar representation** 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 representation**。

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

一个图的**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 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 1 = 4**  
**degree of region 2 = 6** (这里bc被计算了两次)

### Corollary 1

如果 $G$ 是一个**connected planar simple graph**,  $e$ 是边的条数,  $v$ 是顶点的个数,  $v \geq 3$ , 那么 $e \leq 3v - 6$ 。

### Corollary 2

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

### Corollary 3

如果 $G$ 是一个**connected planar simple graph,  $e$ 是边的条数,  $v$ 是顶点的个数,  $v \geq 3$ , 并且 $G$ 中没有长度为3的**circuit**, 那么 $e \leq 2v - 4$ 。**

### Four-color theorem

**Four-color theorem:** 给定一个平面, 把它分成一些连续的区域, 产生一个叫做**map**的图形, **最多只需要四种颜色来给map中的区域染色**, 使得任意两个相邻的区域的颜色不同。

### Chromatic number

色数是指给图中的顶点染色, 使得相邻的顶点颜色不同, 所需的最少颜色数。

根据**Four-color theorem**, 平面图的颜色数不超过4。

记号:  $\chi(G)$ 表示图 $G$ 的色数。

$K_n$ 的色数是 $n$ 。

$K_{m,n}$ 的色数是2。

$C_n$ 的色数是2 (当 $n$ 是偶数的时候) 或者3 (当 $n$ 是奇数的时候)。

### Trees

**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唯一的**simple path**。

### Rooted Trees

**定义:** 一个**rooted tree**是一个**tree**, 其中一个顶点被指定为**root**, 每条边都是从**root**指向其他顶点的。

特别地, 如果 $m = 2$ , 那么这个**rooted tree**被称为**binary tree**。

**Theorem:** 一个有 $n$ 个顶点的**tree**有 $n - 1$ 条边。

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

**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。当 $u$ 是 $v$ 的**parent**的时候,  $v$ 被称为 $u$ 的**child**。

有**child**的顶点被称为**internal vertices**。

以 $a$ 为**root**的**subtree**包括 $a$ 和 $a$ 的**descendants**, 以及所有与这些**descendants**关联的边。

**定义:** 如果一个**rooted tree**的每个**internal vertex**都有不超过 $m$ 个**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**full m-ary tree**。特别地, 如果 $m = 2$ , 那么这个**rooted tree**被称为**binary tree**。

**Theorem:** 一个有 $n$ 个顶点的**tree**有 $n - 1$ 条边。

**Theorem:** 一个有 $i$ 个**internal vertices**的**full m-ary tree**有 $n = mi + 1$ 个顶点。

**Theorem:** 一个有 $n$ 个顶点的**full m-ary tree**有 $\frac{n-1}{m-1}$ 个**internal vertices**和 $\frac{(m-1)n+1}{m-1}$ 个**leaves**。

**Theorem:** 一个有 $i$ 个**internal vertices**的**full m-ary tree**有 $n = mi + 1$ 个顶点和 $M = (m-1)i + 1$ 个**leaves**。

**Theorem:** 一个有 $l$ 个**leaves**的**full m-ary tree**有 $n = \frac{l-1}{m-1} + 1$ 个顶点和 $i = \frac{l-1}{m-1}$ 个**internal vertices**。