

1 Basic Definitions

Below are some basic definitions and terminology that will be used throughout the course. Additional terms and definitions will be introduced as we come across them.

A **graph** G is a tuple consisting of a set $V(G)$ of elements called **vertices**, a set $E(G)$ of pair of vertices called **edges**, and the **endpoint** relations of edges that associate each edge with two vertices. We consider **undirected graphs** for now, in which each edge is a non-directional pairwise relation.

If $e = (v, u)$ is an edge in G , then

e **joins** u and v ; e is **incident** with u and v ;

u and v are **incident** with e ;

u and v are **adjacent** to each other;

u and v are in each others' **neighborhood**.

The **degree** of v is the number of $u \subseteq V(G)$ that are adjacent to v .

The **order** of a graph $G(V, E)$ is $|V|$; the **size** of $G(V, E)$ is $|E|$. If both $|V|$ and $|E|$ are finite, G is called **finite**. A graph of order p and size q is called a (p, q) -graph.

Multiple edges are edges which have the same pair of endpoints. **Loops** are edges in which the endpoints are the same vertex.

A **simple graph** has no multiple edges or loops

A **null graph** is a graph with $V = E = \emptyset$

A **trivial graph** is a graph with $E = \emptyset$ and $|V| = 1$

An **empty graph** is a graph with $E = \emptyset$ and $|V| \geq 1$

A **path** is a simple graph whose vertices can be listed such that any two vertices are adjacent iff they are consecutive in the list. A **cycle** is a simple graph with an equal number of vertices and edges whose vertices can be placed around a circle and two vertices are adjacent iff they appear consecutively along the circle. A **tree** is a simple graph with no cycles.

A **bipartite graph** is a graph which is the union of two disjoint independent sets

A **complete graph**, or **clique**, is a graph where any two vertices in the graph are adjacent. We denote a clique of size n by K_n .

A **complete bipartite graph** or **biclique** with independent sets of sizes n and m we denote as $K_{n,m}$

A **subgraph** of a graph G is a graph H that is entirely **contained** in G ($H \subseteq G$), or that $V(H) \subseteq V(G)$ and $E(H) \subseteq E(G)$ with all endpoint assignment being the same.

2 Real-world Graphs

Real-world graphs are graphs that arise in biology, technology, social science, etc. These include road networks, social networks, protein interaction networks, the brain, the Internet. A number of these graphs have several common and inter-related properties:

Sparsity: Most vertices are only connected to a small fraction of total vertices in the graph. *Example:* How many people are you friends with on Facebook (a social graph) out of the 1.8 billion that use it?

Degree skew: A large difference between maximum and minimum degree for all vertices. A few vertices have a large degree while most vertices have a much smaller degree. *Example:* How celebrities on twitter (a social connection graph) might have millions of followers, whereas you or I might have hundreds.

Hubs: The large degree vertices serve as central hubs, connecting disparate parts of the graph. *Example:* Search engines or other link aggregators on the Internet (information graph).

Irregularity: There is not necessarily a fixed structure based on geometric limitations or similar restrictions. *Example:* Your friends on Facebook can be from any geographic location on the globe.

Small-world: Due to these hubs and irregularity, the vertices in the graph are all quickly accessible from one another. *Example:* How many clicks does it take for you to get from one Wikipedia page to any other? Or six degrees of Kevin Bacon.

3 Graph Representation

There are multiple ways to represent a graph. Below are a few examples.

An **adjacency matrix** $A(G)$ is an $n \times n$ (where $n = |V|$) matrix where a (positive) nonzero value in each $a_{i,j}$ indicates that many edges with endpoints from v_i to v_j . The sum of nonzeros in a row i is equal to the degree of v_i . For a simple graph with no loops, the diagonal will be zeros and the only nonzero appearing will be 1. For undirected graphs, the adjacency matrix will be symmetric.

An **incidence matrix** $M(G)$ is an $n \times m$ (where $n = |V|$ and $m = |E|$) in which a value of 1 in $m_{i,j}$ indicates that v_i is incident on edge e_j . Again the sum of nonzeros in a row i is the degree of v_i .

For memory efficiency with most real-world sparse graphs, adjacency/incidence matrices are rarely used in computation. One of the simplest and most compact graph representations commonly utilized is the **compressed sparse row** (CSR) format. It uses two arrays: the first array L of length $2|E|$ lists in order adjacencies of v_1 then v_2 then \dots v_n . The second array O of length $|V| + 1$ lists offsets for each v_i to where their adjacencies begin in the first array. The degree for any v_i can be calculated as $O[i + 1] - O[i]$.