

Slide 1

### Administrivia

- Reminder: Quiz 6 Wednesday. Likely topics — material about relations and functions from chapter 4.
- In the reading for today (5.1), it's okay to skim/skip the material on planar graphs (pp. 352–356).

Slide 2

### Order of Magnitude of Functions, Recap

- Formal definition:  
Write  $f = \Theta(g)$  to mean that  $f$  and  $g$  have the same order magnitude.  
Define to be true iff there are positive constants  $n_0, c_1, c_2$  such that for all  $x \geq n_0$

$$c_1g(x) \leq f(x) \leq c_2g(x)$$

In other words, these functions are roughly proportional to each other.

- Applying definition formally is possible, but lots of tedious algebra. Examples in text.

### “Big-O Notation”

- The  $O(f(N))$  you see in computer science is similar, but it's a “less than or equal” rather than a “strictly equal” — i.e.,  $f(N) = O(g(N))$  means  $f$ 's order of magnitude is no bigger than  $g$ 's (and might be less).

Formally, true iff there are positive constants  $n_0$  and  $c$  such that for all

$$x \geq n_0$$

$$f(x) \leq cg(x)$$

- Interesting (?) to observe that  $\Theta$  is an equivalence relation, and  $O$  is a partial ordering.

Slide 3

### Order of Magnitude of Functions, Continued

- So we have a way to compare orders of magnitude of functions, with an “equals” ( $\Theta$ ) and a “less-than-or-equal-to” ( $O$ ).
- In general, function's order of magnitude determined by fastest-growing term. Some categories of interest:
  - $x^2$  grows faster than  $x$ ,  $x^3$  faster than  $x^2$ , etc.  $x^2$  and  $cx^2$  “the same”.
  - $\log_b x$  grows more slowly than  $x$ .
  - $b^x$  grows faster than all polynomials.
  - $x^x$  grows faster than all  $b^x$ .

Slide 4

## Graphs — Overview

- In some contexts, “graph” means a plot of a function, other pictorial representation of data.
- In other contexts, it’s an abstract idea meant to represent relationships among a set of things. Examples:
  - Hasse diagrams of chapter 4.
  - Airline route maps.
  - Simplified maps showing driving distances between cities.

Slide 5

Common idea — set of things (set elements, cities) and a notion that some pairs of them are connected somehow. Details we don’t care about have been “abstracted out”.

## Graphs — Definition

- Formal definition (undirected graph):
  - Nonempty set  $N$  of nodes (vertices).
  - Set  $A$  of arcs (edges).
  - Function  $f : A \rightarrow \{\{x, y\} | x, y \in N\}$  (unordered pairs of nodes).Notice that we can have “loops” and also “parallel arcs”.
- Variations/extensions:
  - Directed graph — edges are ordered pairs (i.e., “one-way”).
  - Labeled graph — each vertex has some associated info (“label”).
  - Weighted graph — each edge has some associated info (“weight”).

Slide 6

## Graphs — Terminology

Slide 7

- Adjacent nodes (arc from one to the other).
- Loop, parallel arc.
- Simple graph (no loops or parallel arcs).
- Complete graph (every pair of nodes adjacent).
- Path (sequence of arcs), connected graph.
- Cycle, acyclic graph.

## Isomorphic Graphs

Slide 8

- What we care about is the relationship between nodes and arcs, not exact visual representation.
- Can formalize this as “isomorphism” — two graphs are isomorphic if one is just a “relabeling” of the other.
- Formal definition is in terms of one-to-one functions, one from nodes of graph  $G_1$  to nodes of graph  $G_2$  and one from arcs of graph  $G_1$  to arcs of graph  $G_2$ . Idea is that if an arc connects two nodes in  $G_1$ , the corresponding arc in  $G_2$  connects the corresponding nodes.

### Computer-Friendly Representation of Graphs

- For humans, representing graphs pictorially usually works well. For computers, other representations work better.
- Key idea is to come up with a way to represent the essential information — set of nodes and which ones are connected.

Slide 9

### Adjacency Matrices

- Idea is to put the  $n$  nodes in some (arbitrary) order and define an  $n$ -by- $n$  matrix  $A$  such that  $A_{ij}$  is the number of arcs connecting node  $i$  and node  $j$ .
- For an undirected graph, what property does this matrix have? that it might or might not have for a directed graph?
- Variation: For a weighted graph with no parallel arcs, we could let  $A_{ij}$  be the weight of the arc from node  $i$  to node  $j$ .

Slide 10

### Adjacency Lists

- Idea is to again put  $n$  nodes in some arbitrary order, but rather than a matrix define an array of  $n$  lists, one for each node, with the list for node  $i$  containing all nodes  $j$  that are adjacent to node  $i$ . Parallel arcs mean “duplicate” entries.

Slide 11

### Adjacency Matrix Versus Adjacency List

- Which uses less space?
- Which makes it faster to answer the question “is node  $i$  adjacent to node  $j$ ?”

Slide 12

### Minute Essay

- Which of the following functions are  $O(N^2)$ ?

$$g(N) = 100N^2 + N - 1000$$

$$h(N) = N^3$$

- Which of the following functions are  $O(2^N)$ ?

$$f(N) = 2^N - 5$$

$$h(N) = N!$$

Slide 13

### Minute Essay Answer

- $O(N^2)$ ?

$$g(N) = 100N^2 + N - 1000 \text{ — yes}$$

$$h(N) = N^3 \text{ — no}$$

- $O(2^N)$ ?

$$f(N) = 2^N - 5 \text{ — yes}$$

$$h(N) = N! \text{ — no}$$

Slide 14