### 15.082 and 6.855 J <br> Fall 2010

Network Optimization J.B. Orlin

## WELCOME!

- Welcome to 15.082/6.855J
- Introduction to Network Optimization
- Instructor: James B. Orlin
- TA: David Goldberg
- Textbook: Network Flows: Theory, Algorithms, and Applications by Ahuja, Magnanti, and Orlin referred to as AMO


## Quick Overview

- Next: The Koenigsberg Bridge Problem
- Introduces Networks and Network Algorithms
- Some subject management issues
- Network flows and applications
- Computational Complexity
- Overall goal of today's lecture: set the tone for the rest of the subject
- provide background
- provide motivation
- handle some class logistics


## On the background of students

- Requirement for this class
- Either Linear Programming (15.081J)
- or Data Structures
- Mathematical proofs
- The homework exercises usually call for proofs.
- The midterms will not require proofs.
- For those who have not done many proofs before, the TA will provide guidance


## Some aspects of the class

- Fondness for Powerpoint animations
- Cold-calling as a way to speed up learning of the algorithms
- Talking with partners (the person next to you in in the classroom.)
- Class time: used for presenting theory, algorithms, applications
- mostly outlines of proofs illustrated by examples (not detailed proofs)
- detailed proofs are in the text


## The Bridges of Koenigsberg: Euler 1736

- "Graph Theory" began in 1736

Leonard Eüler

- Visited Koenigsberg
- People wondered whether it is possible to take a walk, end up where you started from, and cross each bridge in Koenigsberg exactly once
- Generally it was believed to be impossible


## The Bridges of Koenigsberg: Euler 1736



Is it possible to start in A, cross over each bridge exactly once, and end up back in A?

## The Bridges of Koenigsberg: Euler 1736



Conceptualization: Land masses are "nodes".

## The Bridges of Koenigsberg: Euler 1736



Conceptualization: Bridges are "arcs."

## The Bridges of Koenigsberg: Euler 1736



Is there a "walk" starting at A and ending at A and passing through each arc exactly once?

## Notation and Terminology

## Network terminology as used in AMO.



An Undirected Graph or Undirected Network


A Directed Graph or Directed Network

Network $\mathbf{G}=(\mathbf{N}, \mathrm{A})$
Node set $\mathrm{N}=\{1,2,3,4\}$
Arc Set $A=\{(1,2),(1,3),(3,2),(3,4),(2,4)\}$
In an undirected graph, $(\mathbf{i}, \mathrm{j})=(\mathrm{j}, \mathrm{i})$

Path: Example: 5, 2, 3, 4.
(or 5, c, 2, b, 3, e, 4)
-No node is repeated.
-Directions are ignored.
Directed Path. Example: 1, 2, 5, 3, 4 (or 1, a, 2, c, 5, d, 3, e, 4)
-No node is repeated.
-Directions are important.
Cycle (or circuit or loop)
1, 2, 3, 1. (or 1, a, 2, b, 3, e)
-A path with 2 or more nodes, except that the first node is the last node.
-Directions are ignored.
Directed Cycle: (1, 2, 3, 4, 1) or
1, a, 2, b, 3, c, 4, d, 1
-No node is repeated.
-Directions are important.


## Walks



Walks are paths that can repeat nodes and arcs Example of a directed walk: 1-2-3-5-4-2-3-5
A walk is closed if its first and last nodes are the A closed walk is a cycle except that it can repeat nodes and arcs.

## The Bridges of Koenigsberg: Euler 1736



Is there a "walk" starting at A and ending at A and passing through each arc exactly once? Such a walk is called an eulerian cycle.

## Adding two bridges creates such a walk



Here is the walk.
A, 1, B, 5, D, 6, B, 4, C, 8, A, 3, C, 7, D, 9, B, 2, A
Note: the number of arcs incident to $B$ is twice the number of times that $B$ appears on the walk.

## On Eulerian Cycles



The degree of a node in an undirected graph is the number of incident arcs

Theorem. An undirected graph has an eulerian cycle if and only if
(1) every node degree is even and
(2) the graph is connected (that is, there is a path from each node to each other node).

## More on Euler's Theorem

- Necessity of two conditions:
- Any eulerian cycle "visits" each node an even number of times
- Any eulerian cycle shows the network is connected
- caveat: nodes of degree 0
- Sufficiency of the condition
- Assume the result is true for all graphs with fewer than $|A|$ arcs.
- Start at some node, and take a walk until a cycle $\mathbf{C}$ is found.



## More on Euler's Theorem

- Sufficiency of the condition
- Start at some node, and take a walk until a cycle C is found.
- Consider G' = (N, AlC)
- the degree of each node is even
- each component is connected
- So, $G^{\prime}$ is the union of Eulerian cycles
- Connect $\mathbf{G}^{\prime}$ into a single eulerian cycle by adding $\mathbf{C}$.



## Comments on Euler's theorem

1. It reflects how proofs are done in class, often in outline form, with key ideas illustrated.
2. However, this proof does not directly lead to an efficient algorithm. (More on this in two lectures.)
3. Usually we focus on efficient algorithms.

### 15.082/6.855J Subject Goals:

1. To present students with a knowledge of the state-of-the art in the theory and practice of solving network flow problems.

A lot has happened since 1736
2. To provide students with a rigorous analysis of network flow algorithms.
computational complexity \& worst case analysis
3. To help each student develop his or her own intuition about algorithm development and algorithm analysis.

## Homework Sets and Grading

- Homework Sets
- 6 assignments
- 4 points per assignment
- lots of practice problems with solutions
- Grading
- homework: 24 points
- Project 16 points
- Midterm 1: 30 points
- Midterm 2: 30 points


## Class discussion

- Have you seen network models elsewhere?
- Do you have any specific goals in taking this subject?


## Mental break

Which nation gave women the right to vote first?
New Zealand.

Which Ocean goes to the deepest depths?
Pacific Ocean

What is northernmost land on earth?
Cape Morris Jessep in Greenland

Where is the Worlds Largest Aquarium?
Epcot Center in Orlando, FL

## Mental break

What country has not fought in a war since 1815 ?
Switzerland
What does the term Prima Donna mean in Opera?
The leading female singer
What fruit were Hawaiian women once forbidden by law to eat?

The coconut
What's the most common non-contagious disease in
the world?
Tooth decay

## Three Fundamental Flow Problems

- The shortest path problem
- The maximum flow problem
- The minimum cost flow problem


## The shortest path problem



Consider a network $G=(N, A)$ in which there is an origin node $s$ and a destination node $t$. standard notation: $\mathbf{n}=|\mathbf{N}|, \mathbf{m}=|\mathbf{A}|$

What is the shortest path from sto t ?

## The Maximum Flow Problem

- Directed Graph G = (N, A).
- Source s
- Sink t
- Capacities $\mathbf{u}_{\mathrm{ij}}$ on $\operatorname{arc}(\mathrm{i}, \mathrm{j})$
- Maximize the flow out of $s$, subject to

Flow out of $\mathbf{i}=$ Flow into $\mathbf{i}$, for $\mathbf{i} \neq \mathbf{s}$ or $\mathbf{t}$.


A Network with Arc Capacities (and the maximum flow)

## Representing the Max Flow as an LP


$\max v$
s.t $x_{s 1}+x_{s 2}=v$

$$
-x_{s 1}+x_{12}+x_{1 t}=0
$$

$$
-x_{s 2}-x_{12}+x_{2 t}=0
$$

$$
-x_{1 t}-x_{2 t} \quad=-v
$$

$0 \leq x_{i j} \leq u_{i j}$ for all $(i, j)$

Flow out of $\mathbf{i}$ - Flow into $\mathbf{i}=0$ for $\mathrm{i} \neq \mathrm{s}$ or t .
$\max v$
s.t. $\sum_{\mathrm{j}} \mathrm{x}_{\mathrm{sj}}=\mathrm{v}$
$\sum_{\mathrm{j}} \mathrm{x}_{\mathrm{ij}}-\sum_{\mathrm{j}} \mathrm{x}_{\mathrm{ji}}=0$ for each ifs or t
s.t. $-\sum_{i} x_{i t}=-v$
$0 \leq x_{i j} \leq u_{i j}$ for all $(i, j)$

## Min Cost Flows



Each arc has a
linear cost and a
capacity

$$
\min \sum_{i, \mathrm{j}} \mathrm{c}_{\mathrm{ij}} \mathrm{x}_{\mathrm{ij}}
$$

s.t $\quad \sum_{j} x_{i j}-\sum_{j} x_{j i}=b(i)$ for each $i$

$$
0 \leq \mathrm{x}_{\mathrm{ij}} \leq \mathrm{u}_{\mathrm{ij}} \text { for all }(\mathrm{i}, \mathrm{j})
$$

Covered in detail in Chapter 1 of AMO

## Where Network Optimization Arises

- Transportation Systems
- Transportation of goods over transportation networks
- Scheduling of fleets of airplanes
- Manufacturing Systems
- Scheduling of goods for manufacturing
- Flow of manufactured items within inventory systems
- Communication Systems
- Design and expansion of communication systems
- Flow of information across networks
- Energy Systems, Financial Systems, and much more


## Next topic: computational complexity

-What is an efficient algorithm?

- How do we measure efficiency?
- "Worst case analysis"
- but first ...


## Measuring Computational Complexity

- Consider the following algorithm for adding two $\mathbf{m} \times \mathrm{n}$ matrices A and B with coefficients $a($,$) and b($,$) .$
begin

$$
\begin{aligned}
& \text { for } \mathbf{i}=\mathbf{1} \text { to } \mathbf{m} \text { do } \\
& \text { for } \mathrm{j}=\mathbf{1} \text { to } \mathbf{n} \text { do } \mathbf{c}(\mathbf{i}, \mathrm{j}):=\mathbf{a}(\mathbf{i}, \mathrm{j})+\mathbf{b}(\mathbf{i}, \mathrm{j})
\end{aligned}
$$

end
What is the running time of this algorithm?

- Let's measure it as precisely as we can as a function of $\mathbf{n}$ and $m$.
- Is it 2 nm , or 3 nm , or what?

Worst case versus average case

- How do we measure the running time?
- What are the basic steps that we should count?


## Compute the running time precisely.

# Operation Number (as a function of $m, n$ ) 

Additions

Assignments
Comparisons
Multiplications

## Towards Computational Complexity

1. We will ignore running time constants.
2. Our running times will be stated in terms of relevant problem parameters, e.g., nm.
3. We will measure everything in terms of worst case or most pessimistic analysis (performance guarantees.)
4. All arithmetic operations are assumed to take one step, (or a number of steps that is bounded by a constant).

## A Simpler Metric for Running Time.

- Operation Number (as a function of m,n)
- Additions $\leq c_{1} m n$ for some $c_{1}$ and $m, n \geq 1$
- O(mn) steps
- Assignments $\leq c_{2} m n$ for some $c_{2}$ and $m, n \geq 1$
- O(mn) steps
- Comparisons $\leq c_{3} m n$ for some $c_{3}$ and $m, n \geq 1$
- O(mn) steps
- TOTAL $\leq c_{4} m n$ for some $c_{4}$ and $m, n \geq 1$
- O(mn) steps


## Simplifying Assumptions and Notation

- MACHINE MODEL: Random Access Machine (RAM).
This is the computer model that everyone is used to. It allows the use of arrays, and it can select any element of an array or matrix in $O(1)$ steps.
- $\mathbf{c}(\mathrm{i}, \mathrm{j}):=\mathrm{a}(\mathrm{i}, \mathrm{j})+\mathrm{b}(\mathrm{i}, \mathrm{j})$.
- Integrality Assumption. All numbers are integral (unless stated otherwise.)


## Size of a problem

- The size of a problem is the number of bits needed to represent the problem.
- The size of the $n \times m$ matrix $A$ is not $n m$.
- If each matrix element has $K$ bits, the size is nmK
e.g., if $\max 2^{107}<\mathrm{a}_{\mathrm{ij}}<2^{108}$, then $K=108$.
- $K=O\left(\log \left(a_{\text {max }}\right)\right)$.


## Polynomial Time Algorithms

- We say that an algorithm runs in polynomial time if the number of steps taken by an algorithm on any instance $I$ is bounded by a polynomial in the size of I.
- We say that an algorithm runs in exponential time if it does not run in polynomial time.
- Example 1: finding the determinant of a matrix can be done in $O\left(n^{3}\right)$ steps.

This is polynomial time.

## Polynomial Time Algorithms

- Example 2: We can determine if $\mathbf{n}$ is prime by dividing $\mathbf{n}$ by every integer less than $n$.
- This algorithm is exponential time.
- The size of the instance is $\log n$
- The running time of the algorithm is $\mathbf{O ( n )}$.
- Side note: there is a polynomial time algorithm for determining if $\mathbf{n}$ is prime.
- Almost all of the algorithms presented in this class will be polynomial time.
- One can find an Eulerian cycle (if one exists) in O(m) steps.
- There is no known polynomial time algorithm for finding a min cost traveling salesman tour


## On polynomial vs exponential time

- We contrast two algorithm, one that takes 30,000 n $^{3}$ steps, and one that takes $2^{n}$ steps.
- Suppose that we could carry out 1 billion steps per second.
\# of nodes $\quad 30,000 \mathrm{n}^{3}$ steps $2^{\mathrm{n}}$ steps
$\mathrm{n}=30, \quad 0.81$ seconds $\quad 1$ second
$\mathrm{n}=40, \quad 1.92$ seconds $\quad 17$ minutes
$\mathrm{n}=50 \quad 3.75$ seconds
$\mathrm{n}=\mathbf{6 0}$
6.48 seconds

12 days
31 years

## On polynomial vs. exponential time

- Suppose that we could carry out 1 trillion steps per second, and instantaneously eliminate 99.9999999\% of all solutions as not worth considering
\# of nodes
$\mathrm{n}=70$,
$\mathrm{n}=80$,
$\mathrm{n}=90$
$\mathrm{n}=100$
$1,000 n^{10}$ steps $\quad \underline{2}^{\mathrm{n}}$ steps
2.82 seconds 1 second
10.74 seconds 17 minutes
34.86 seconds 12 days

100 seconds 31 years

## Overview of today's lecture

- Eulerian cycles
- Network Definitions
- Network Applications
- Introduction to computational complexity


## Upcoming Lectures

- Lecture 2: Review of Data Structures
- even those with data structure backgrounds are encouraged to attend.
- Lecture 3. Graph Search Algorithms.
- how to determine if a graph is connected
- and to label a graph
- and more

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