

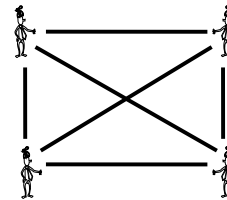
# 15-251

## Great Theoretical Ideas in Computer Science

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## Graphs II

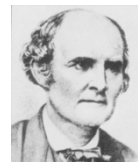
Lecture 19, October 26, 2010




## Recap

## Cayley's Formula

The number of labeled trees on  $n$  nodes is  $n^{n-2}$






A graph is planar if it can be drawn in the plane without crossing edges

**Kuratowski's Theorem**  
A graph  $G$  is planar if and only if  $K_{3,3}$  and  $K_5$  are not minors of  $G$ .

The 5-color theorem and the 4-color theorem

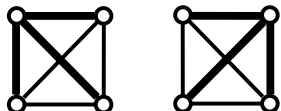
## Euler's Formula

If  $G$  is a connected planar graph with  $n$  vertices,  $e$  edges and  $f$  faces, then  $n - e + f = 2$



## Spanning Trees

A spanning tree of a graph G is a tree that touches every node of G and uses only edges from G



Every connected graph has a spanning tree

## Counting Spanning Trees

How can we count the number of spanning trees in a graph?

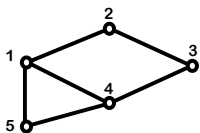
Brute force: try all  $\binom{e}{n-1}$  subsets of  $n-1$  edges.

There's a faster way.

## Counting Spanning Trees Efficiently

Form the Laplacian of the graph. This is an  $n \times n$  matrix L, where:

$$L_{ij} = \begin{cases} \text{Degree}(i) & \text{if } i=j \\ -1 & \text{if } (i,j) \in E \\ 0 & \text{otherwise} \end{cases}$$



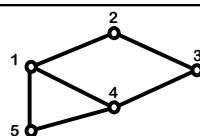
$$L = \begin{bmatrix} 3 & -1 & 0 & -1 & -1 \\ -1 & 2 & -1 & 0 & 0 \\ 0 & -1 & 2 & -1 & 0 \\ -1 & 0 & -1 & 3 & -1 \\ -1 & 0 & 0 & -1 & 2 \end{bmatrix}$$

## Counting Spanning Trees Efficiently

**Matrix-Tree Theorem:** The number of spanning trees of a graph is the determinant of the Laplacian with one row and column removed.

Proof:

Beyond the scope of this course



$$L = \begin{bmatrix} 3 & -1 & 0 & -1 & -1 \\ -1 & 2 & -1 & 0 & 0 \\ 0 & -1 & 2 & -1 & 0 \\ -1 & 0 & -1 & 3 & -1 \\ -1 & 0 & 0 & -1 & 2 \end{bmatrix}$$

$$\begin{vmatrix} 2 & -1 & 0 & 0 \\ -1 & 2 & -1 & 0 \\ 0 & -1 & 3 & -1 \\ 0 & 0 & -1 & 2 \end{vmatrix} = 11 \quad (\text{do on doc cam})$$

Number of spanning trees = 11 (do on doc cam)

If G is the complete graph on n nodes what happens? We have this  $(n-1) \times (n-1)$  det:

$$\begin{vmatrix} n-1 & -1 & \dots & -1 \\ -1 & n-1 & \dots & -1 \\ \vdots & \vdots & \ddots & \vdots \\ -1 & -1 & \dots & n-1 \end{vmatrix} \xrightarrow{\text{Subtract 1st column from every other column}} \begin{vmatrix} n-1 & -n & \dots & -n \\ -1 & n & \dots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ -1 & 0 & \dots & n \end{vmatrix}$$

$$\xrightarrow{\text{Add every one of the rows to the first}} \begin{vmatrix} 1 & 0 & \dots & 0 \\ -1 & n & \dots & 0 \\ \vdots & \vdots & \ddots & \vdots \\ -1 & 0 & \dots & n \end{vmatrix} = n^{n-2} \quad \text{Cayley's Formula!}$$

This is a beautiful example from

## Spectral Graph Theory

Which involves using linear algebra to study and compute things on graphs

## Finding Minimum Spanning Trees

Say that each edge in a graph has a cost. A very natural question to ask is:

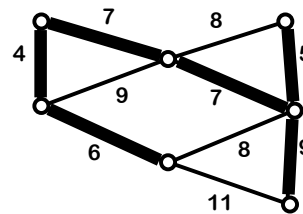
What is the cheapest subset of edges that connect the nodes?

i.e: what is the minimum spanning tree of the graph?

## Finding Optimal Trees

Problem: Find a minimum spanning tree, that is, a tree that has a node for every node in the graph, such that the sum of the edge weights is minimum

## Minimum Spanning Trees



## Kruskal's Algorithm



A simple algorithm for finding a minimum spanning tree

## Finding an MST: Kruskal's Algorithm

Create a forest where each node is a separate tree

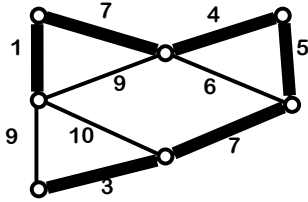
Make a sorted list of edges  $S$

While  $S$  is non-empty:

Remove an edge from  $S$  with minimal weight

If it connects two different trees, add the edge. Otherwise discard it.

### Applying the Algorithm



### Proving the Algorithm Works

The algorithm outputs a spanning tree  $T$ .

Suppose that it's not minimal. (For simplicity, assume all edge weights in graph are distinct)

Let  $M$  be a minimum spanning tree.

Let  $e$  be the first edge chosen by the algorithm that is not in  $M$ .

If we add  $e$  to  $M$ , it creates a cycle. Since this cycle isn't fully contained in  $T$ , it has an edge  $f$  not in  $T$ .

$N = M + e - f$  is another spanning tree.

### Proving the Algorithm Works

$N = M + e - f$  is another spanning tree.

Claim:  $e < f$ , and therefore  $N < M$

Suppose not:  $e > f$

Then  $f$  would have been visited before  $e$  by the algorithm, but not added, because adding it would have formed a cycle.

But all of these cycle edges are also edges of  $M$ , since  $e$  was the first edge not in  $M$ . This contradicts the assumption  $M$  is a tree.

### Greed is Good (In this case...)

The greedy algorithm, by adding the least costly edges in each stage, succeeds in finding an MST

But — in math and life — if pushed too far, the greedy approach can lead to bad results.

### TSP: Traveling Salesman Problem

Given a number of cities and the costs of traveling from any city to any other city, what is the cheapest round-trip route that visits each city at least once and then returns to the starting city?

### TSP from Trees

We can use an MST to derive a TSP tour that is no more expensive than twice the optimal tour.

Idea: walk "around" the MST and take shortcuts if a node has already been visited.

We assume that all pairs of nodes are connected, and edge weights satisfy the triangle inequality  $d(x,y) \leq d(x,z) + d(z,y)$

### Tours from Trees

Shortcuts only decrease the cost, so  
 $\text{Cost}(\text{Greedy Tour}) \leq 2 \text{Cost}(\text{MST})$   
 $\leq 2 \text{Cost}(\text{Optimal Tour})$

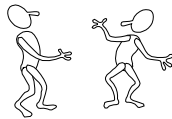
This is a 2-competitive algorithm

### Bipartite Graph

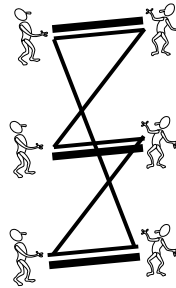
A graph is bipartite if the nodes can be partitioned into two sets  $V_1$  and  $V_2$  such that all edges go only between  $V_1$  and  $V_2$  (no edges go from  $V_1$  to  $V_1$  or from  $V_2$  to  $V_2$ )

### Dancing Partners

A group of 100 boys and girls attend a dance. Every boy knows 5 girls, and every girl knows 5 boys. Can they be matched into dance partners so that each pair knows each other?



### Dancing Partners



### Perfect Matchings

A matching is a set of edges, no two of which share a vertex. The matching is perfect if it includes every vertex.

**Regular Bipartite Matching Theorem:** If every node in a bipartite graph has the same degree  $d \geq 1$ , then the graph has a perfect matching.

**Note:** if degrees are the same then  $|A| = |B|$ , where A is the set of nodes “on the left” and B is the set of nodes “on the right”

### A Matter of Degree

**Claim:** If degrees are the same then  $|A| = |B|$

**Proof:**

If there are  $m$  boys, there are  $md$  edges

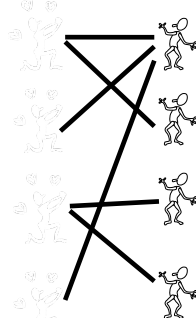
If there are  $n$  girls, there are  $nd$  edges

The Regular Bipartite Matching Theorem follows from a stronger theorem, which we now come to. (Remind me to return to the proof of the RBMT later.)

### The Marriage Theorem

**Theorem:** A bipartite graph has a perfect matching if and only if  $|A| = |B| = n$  and for all  $k \in [1, n]$ : for any subset of  $k$  nodes of  $A$  there are at least  $k$  nodes of  $B$  that are connected to at least one of them.

### The Marriage Theorem



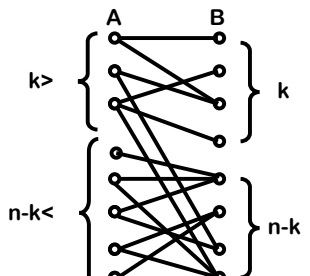
For any subset of (say)  $k$  nodes of  $A$  there are at least  $k$  nodes of  $B$  that are connected to at least one of them

The condition fails for this graph

### The Feeling is Mutual

The condition of the theorem still holds if we swap the roles of  $A$  and  $B$ : If we pick any  $k$  nodes in  $B$ , they are connected to at least  $k$  nodes in  $A$

Proof by Contradiction:



### Proof of Marriage Theorem

Call a bipartite graph "matchable" if it has the same number of nodes on left and right, and any  $k$  nodes on the left are connected to at least  $k$  on the right

Strategy: Break up the graph into two matchable parts, and recursively partition each of these into two matchable parts, etc., until each part has only two nodes

### Proof of Marriage Theorem

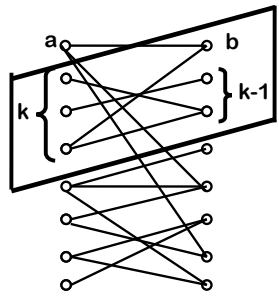
Select two nodes  $a \in A$  and  $b \in B$  connected by an edge

Idea: Take  $G_1 = (a, b)$  and  $G_2 =$  everything else

If  $G_2$  is matchable, we're done. So let's assume that  $G_2$  is not matchable.

If  $G_2$  is not matchable then there is a set of  $k$  nodes in  $G_2$  that has only  $k-1$  neighbors.

### Proof of Marriage Theorem



The only way this could fail is if one of the missing nodes is  $b$

Add this in to form  $G_1$ , and take  $G_2$  to be everything else.

This is a matchable partition!\*

(\*Done in lecture on the document cam.)

### Example



Suppose that a standard deck of cards is dealt into 13 piles of 4 cards each

Then it is possible to select a card from each pile so that the 13 chosen cards contain exactly one card of each rank

**Proof:** Form a bipartite graph as follows: Start with 52 cards on the left and the same 52 cards on the right, connected by 52 edges.

Now group the cards on the left into 13 sets according to the given piles. Group the cards on the right into 13 groups according to rank. Let the edges be inherited from the original ones.

This bipartite graph is matchable --  $k$  groups on the left have to connect to  $4k$  cards on the right, thus they connect to at least  $k$  groups on the right.

And thus has a perfect matching.

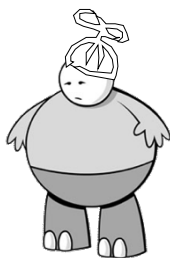
### Generalized Marriage: Hall's Theorem

Let  $S = \{S_1, S_2, \dots, S_n\}$  be a set of finite subsets that satisfies: For any subset  $T$  of  $\{1, 2, \dots, n\}$  let  $U$  = the union of  $S_t$  for  $t$  in  $T$ , we have:  $|U| \geq |T|$ .  
I.E. any  $k$  subsets contain at least  $k$  elements

Then we can choose an element  $x_i$  from each  $S_i$  so that  $\{x_1, x_2, \dots\}$  are all distinct

The proof of Hall's Theorem is slightly more complicated (but not much) than our proof of the Marriage Theorem.

You can find the proof on Wikipedia, or on pages 218 and 219 of *Mathematical Thinking* by D'Angelo and West.



Here's What  
You Need to  
Know...

#### Minimum Spanning Tree

- Definition

#### Counting spanning trees

- Matrix-Tree Theorem

#### Kruskal's Algorithm

- Definition

- Proof of Correctness

#### Traveling Salesman Problem

- Definition

- Using MST to get an  
approximate solution

#### The Marriage Theorem