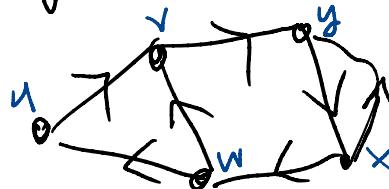


Reminders: • Still working on HW#2 grading...

- HW#3 posted, due next Wed. 3/10.

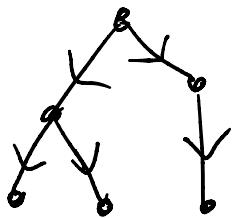
We'll continue today with some 'supplemental material' about graph theory.

Today we will discuss a new variant of graphs. A **directed graph** (or **digraph**)  $G$  is like a usual 'undirected' graph, except that each edge comes with an orientation, either 'u to v' or 'v to u'. We draw directed graphs using arrows:



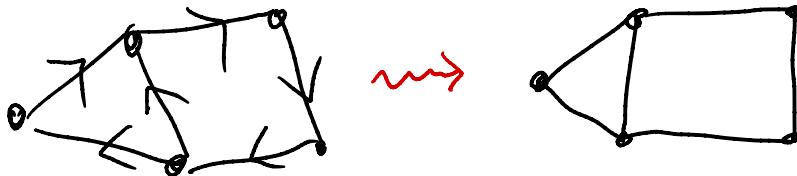
Formally, we represent the edges of a digraph using ordered pairs  $e = (u, v)$ .

Digraphs are useful for modeling **non-symmetric relations**. For example, we already saw this with rooted trees:



Here the relation could be 'is father of'.

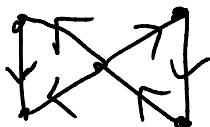
Every directed graph has an **underlying undirected graph** obtained by forgetting orientations:



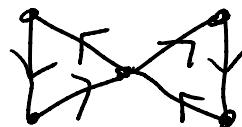
We can talk about walks, paths, cycles, etc. in the underlying undirected graph, but makes more sense to study **directed walks**, **directed paths**, etc., which are those that only traverse edges in the direction of their orientation.



There are correspondingly two notions of connectivity for digraphs:  $G$  is **(weakly) connected** if its underlying undirected graph is connected, and is **strongly connected** if any two vertices are joined by a directed path in both directions:



(weakly) connected



strongly connected

Finally, we have two kinds of degrees of vertices of directed graphs:

**indegree( $v$ )** = # arrows pointing into  $v$

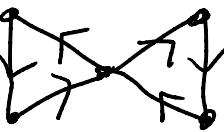
**outdegree( $v$ )** = # arrows pointing out of  $v$

e.g.       $\text{indegree} = 2$ ,  $\text{outdegree} = 3$

Many of the results for undirected graphs we discussed have directed analogs

Thm For connected digraph  $G, \exists$  a directed Eulerian circuit iff  $\text{indegree}(v) = \text{outdegree}(v) \forall v$ .

PF: Basically identical to undirected ...  $\square$

e.g.  'one-way bridges'

There's a directed version of the adjacency matrix  $A_G = (a_{ij})$ :

$$a_{ij} = \begin{cases} 1 & \text{if } i \rightarrow j \\ 0 & \text{otherwise} \end{cases}$$

Note  $A_G$  is no longer symmetric!

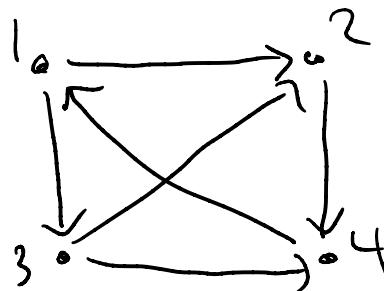
But  $A_G^l[i, j]$  still counts # (directed) walks of length  $l$  from  $i$  to  $j$ .

There's even a directed version of the Matrix-Tree Thm for counting rooted spanning trees.

## Tournaments

An important class of directed graphs are **tournaments**: those whose underlying undirected graph is a complete graph:

e.g.



They're called tournaments b/c we can think of them as encoding results of a **round-robin tournament** where every team plays every other team once, and  $i \rightarrow j$  means  $i$  beat  $j$ .

Given a tournament, we might want to rank the teams at the end:

$t_1$  <sup>1<sup>st</sup> place</sup>,  $t_2$ ,  $t_3$ , ...,  $t_n$  <sup>last place</sup>

Ideally, each team would beat every team ranked lower than it (no upsets). Call the ranking a **perfect ranking** in this case. Only very special tournaments have perfect rankings.

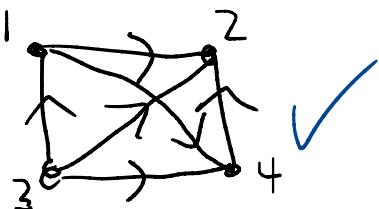
Say tournament  $T$  is **transitive** if whenever  $i \rightarrow j$  and  $j \rightarrow k$ , then also  $i \rightarrow k$ .

Say  $T$  is **acyclic** if it has no directed cycles.

Thm For tournament  $T$ , TFAE:

- $T$  has perfect ranking,
- $T$  is transitive,
- $T$  is acyclic

e.g.



Need a lemma about all tournaments first:

Lemma Every tournament has a directed Hamiltonian path.

Pf: By induction on # vertices. Base case ✓

Assume by induction have path

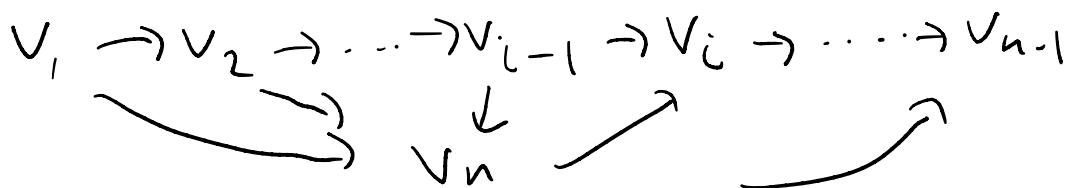
$$v_1 \rightarrow v_2 \rightarrow v_3 \rightarrow \dots \rightarrow v_{n-1}$$

and are adding vertex  $v_n$ . If

$v_n \rightarrow v_1$ , can add at beginning. And

if  $v_{n-1} \rightarrow v_n$ , can add  $v_n$  at end.

So assume that  $v_1 \rightarrow v_n$  and  $v_n \rightarrow v_{n-1}$ :



Let  $v_i$  be smallest  $i$  s.t.  $v_n \rightarrow v_i$ .

Then  $v_1 \rightarrow v_2 \rightarrow \dots \rightarrow v_{i-1} \rightarrow v_n \rightarrow v_i \rightarrow \dots \rightarrow v_{n-1}$  is our desired path.  $\square$

Rmk: Can show # ham. paths is odd!

Pf of thm: 1  $\Rightarrow$  2: if perfect ranking is  $v_1, v_2, \dots, v_n$ , then arrows go from lower index to higher, so transitive.

2  $\Rightarrow$  3: Suppose we had a cycle. Let  $v_1 \rightarrow v_2 \rightarrow \dots \rightarrow v_k \rightarrow v_1$  be cycle of min. length. By transitivity,  $v_{k-1} \rightarrow v_1$ , so  $v_1 \rightarrow \dots \rightarrow v_{k-1} \rightarrow v_1$  is a shorter cycle, a contradiction.

3  $\Rightarrow$  1: By lemma, have a ham. path  $v_1 \rightarrow v_2 \rightarrow \dots \rightarrow v_n$ . Let this be ranking. Any upset would yield a cycle.  $\square$

Q: How many transitive tournaments on  $n$  vertices are there?

Q: How many total tournaments on  $n$  vertices are there?

Note: Can show  $\exists$  unique ham. path  $\Leftrightarrow T$  is transitive.

## Ranking tournaments

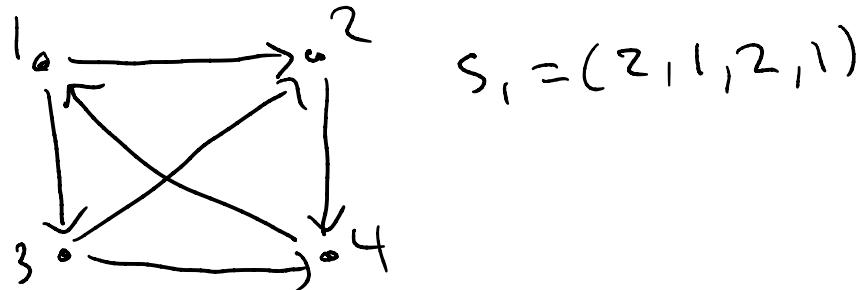
If we have a transitive tournament,  
we know how to rank the teams.  
But what about for non-transitive  $T$ ?

Common to define a **score vector**

$$S_1 = (S_1(1), S_1(2), \dots, S_1(n))$$

w/  $S_1(i) = \# \text{ teams } i \text{ beat}$ .

e.g.



But we might want to give more credit for beating better teams,  
so define **secondary score vector**

$$S_2 = (S_2(1), S_2(2), \dots, S_2(n))$$

w/  $S_2(i) = \sum S_1(j)$  for teams  $j$  that  $i$  beat

e.g.  $S_2 = (3, 1, 2, 2)$  for above  $T$

And we can keep going, defining

$$S_K = (S_K(1), S_K(2), \dots, S_K(n))$$

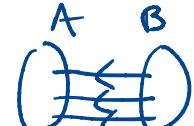
w/  $S_K(i) = \sum_{j \rightarrow i} S_{K-1}(j)$ .

e.g.  $S_3 = (3, 2, 3, 3)$

$$S_4 = (5, 3, 5, 3)$$

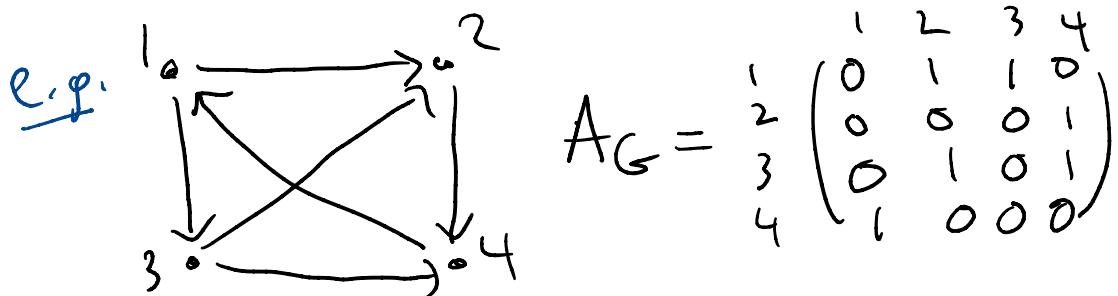
$$S_5 = (8, 3, 6, 5) \dots$$

We might wonder if  $\lim_{K \rightarrow \infty} S_K$  exists?

Thm (Kendall-Wei method)  $\xrightarrow{\text{if } T \text{ is irreducible}}$  no    
 If  $T$  is irreducible then its adjacency matrix  $A_G$  has a largest real eigenvalue  $\lambda_1$ , w/ 1-dim eigenspace,

and  $\lim_{K \rightarrow \infty} \frac{S_K}{\sum_i S_K(i)}$  is a  $\lambda_1$ -eigenvector.

normalize so sum of entries = 1



Wolfram alpha tells me that

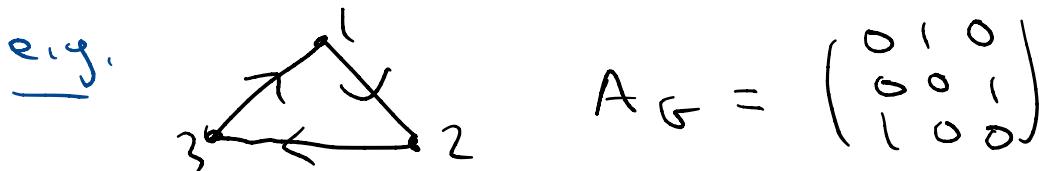
$$\lambda_1 \approx 1.395 \dots$$

w/ eigenvector

$$( .321 \dots, .165 \dots, .283 \dots, .230 \dots )$$

So Kendall-Wei method says we rank:

$$1, 3, 4, 2$$



$$\text{largest eigenvalue: } \lambda_1 = 1$$

$$\text{w/ eigenvector } (1/3, 1/3, 1/3)$$

No way to rank teams!