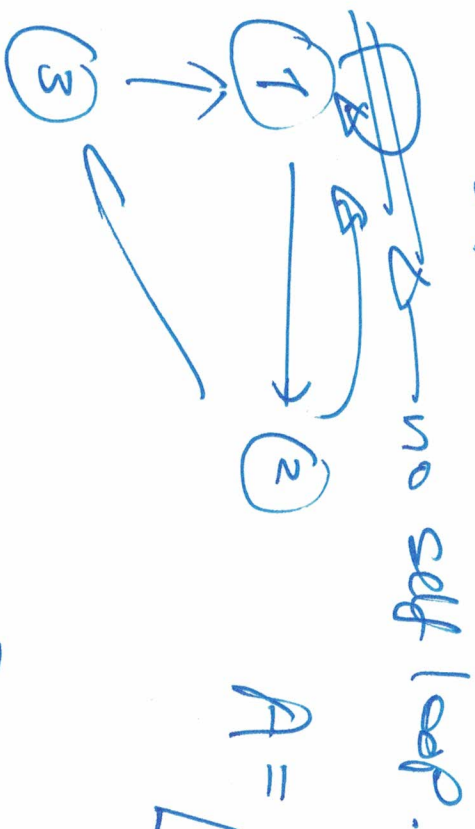


Cpts 515. 11/9/2020

Laplacian. A technique to transform a graph to a "nice" matrix.

Let  $G$  be a directed graph.

Example:



$$A = \begin{bmatrix} 0 & 1 & 0 \\ 1 & 0 & 1 \\ 1 & 0 & 0 \end{bmatrix}$$

$$D = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 2 & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

This "2" means: out degree of node 2 is 2.

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

Good properties:

all eigenvalues of  $L$  is  $\geq 0$ . <sup>all reals.</sup> Those  $n$  <sup># of nodes</sup> eigenvalues from the spectrum of  $G$ .

We can use the spectrum to test whether two graphs are isomorphic.

---

Random Walk on a graph.  $\rightarrow$  We have many approaches to do the same, after different results.

Applications: we want to create a "random" sample from some data. Our approach: (1) create a "model" of the data

(2) the model is a graph.

(3) Random in the model.

$\rightarrow$  sample.

Example. (most common way) ~~software design like ML.~~

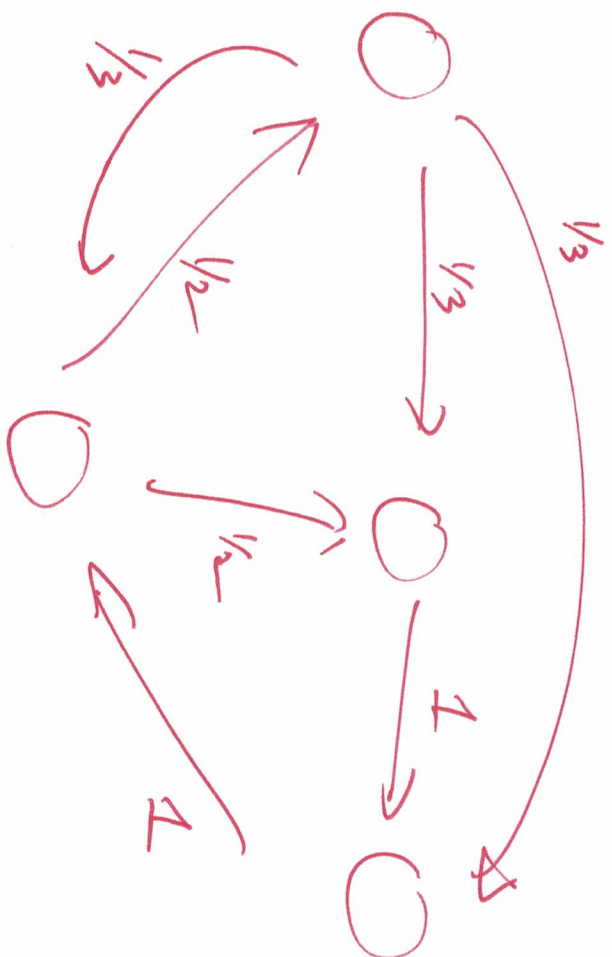
Given a graph (model of data), ~~this graph~~ doesn't have any probability !!!

(Note: recall Bayesian Network. ~~trouble~~ who is going to give you the probability assignments?)



$\Rightarrow$  How to assign "transmission" probabilities on edges?

$$P_{ij} = \frac{1}{\text{Outdegree}(i)}$$



Remark: ① It's stationary dist is unique and can be efficiently computed.

② It's arguable that a sequence of nodes (it's a walk) generated from this graph or marked chain is "random".

③. "local" randomness but NOT global randomness.

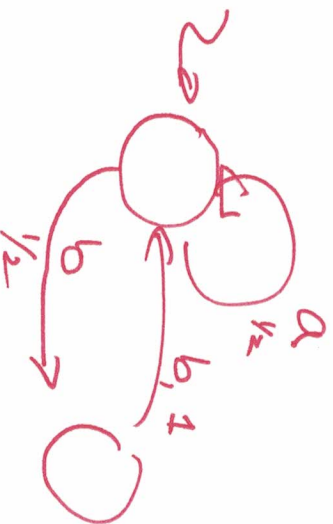
⊕. Do you have other ways to assign these probabilities?  
yes. roughly:

- $G \rightarrow$  adjacent matrix  $A$
- (... transform on this matrix.  $e^{-A}$ )
- $\rightarrow$  Perron number's left & right-eigenvectors
- $\rightarrow$  multiply these two eigenvectors
- $\rightarrow$  [Fig]. (true random walk).

Example:  $\mathcal{Z} =$   
string is  $\mathcal{Z}$ .

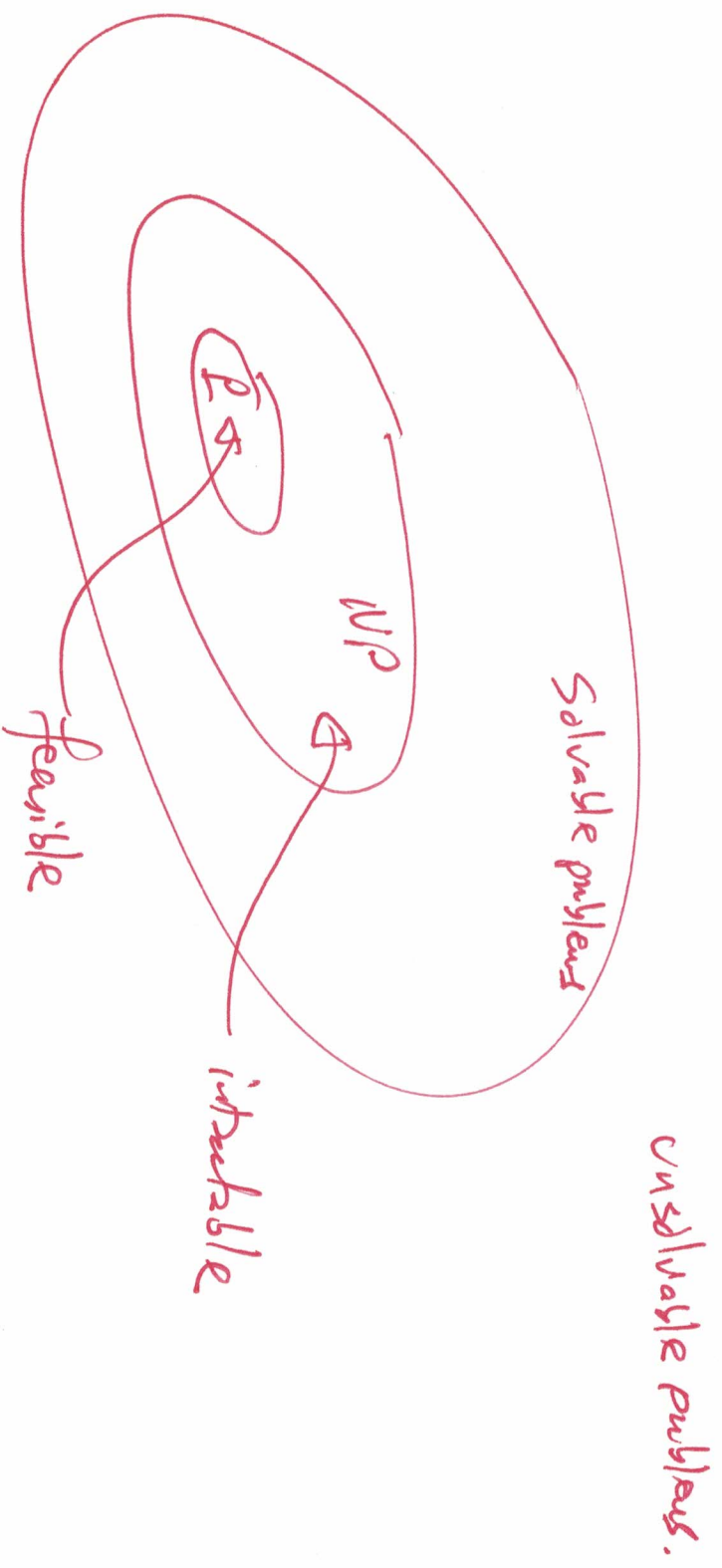
$$(a + b b)^*$$

Atg to generate a random



don't give you "random"  
string in  $\mathcal{Z}$ .





Algs can only solve a small portion of problems, within reasonable resources. (time and/or space).

P, NP, #P, etc.

Recall: Problem = a set of positive instances  
= a set of strings  
= a language.

Example problem: Given: a graph  $G$

Question: Is  $G$  connected?

$\{ \langle G \rangle : G \text{ is connected} \}$

String encoding of  $G$ .

Complexity class: a class of problems that can be solved by algorithms within a given complexity.

We focus on "time" complexity.

Poly-time:  $O(n^3)$ ;  $O(n^4)$ , ...

exp-time:  $O(2^n)$ .

---

$$\lim_{n \rightarrow \infty} \frac{2^n}{n^4} = \infty.$$

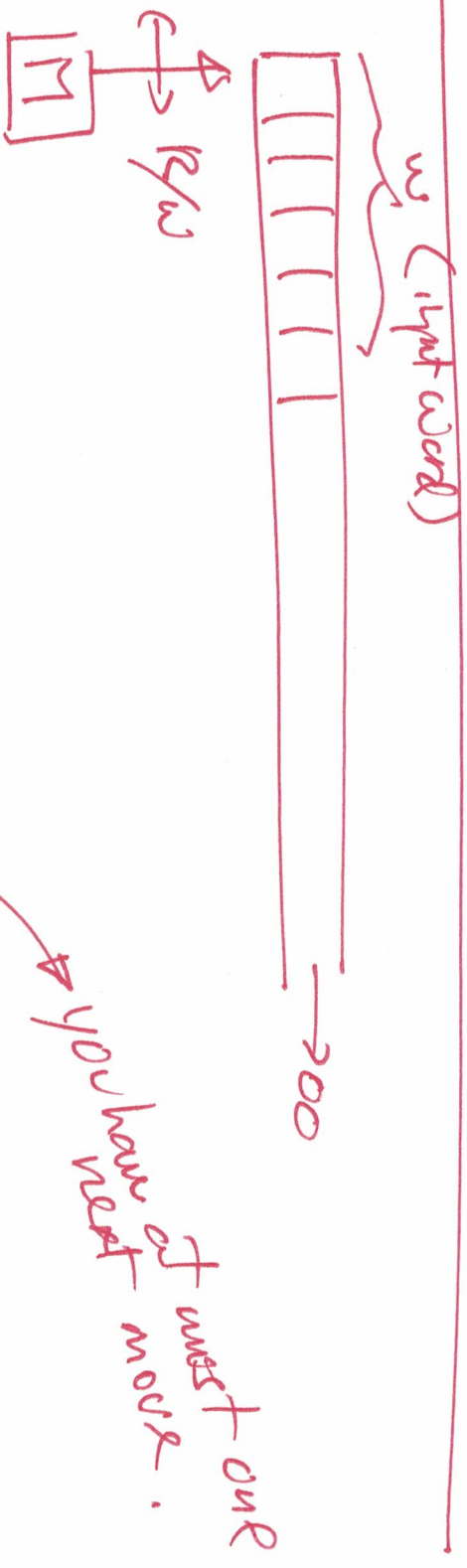
---

"feasible", "tractable" — a problem that has poly-time ~~to~~ alg to solve;

"infeasible", "intractable" — "inherently" difficult.  
NP-complete.



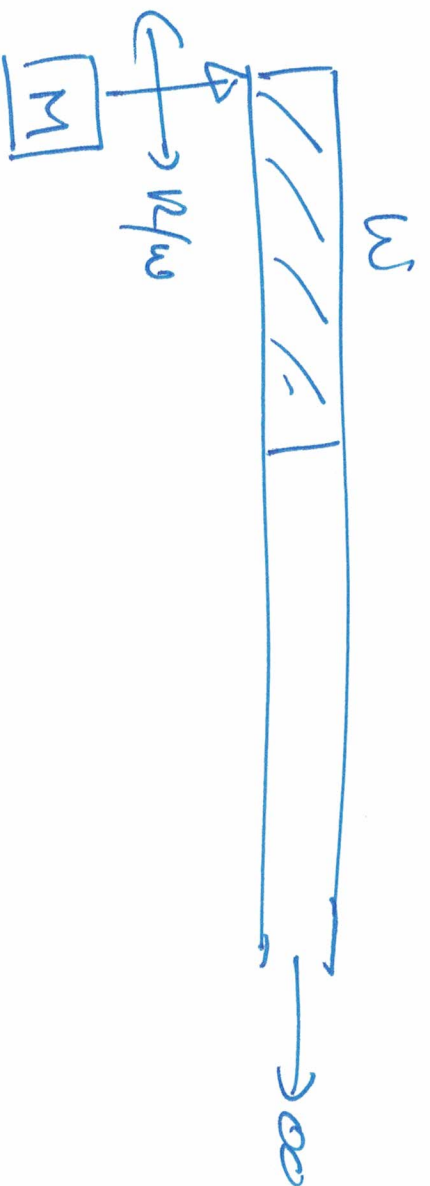
Recall:  $\begin{cases} \text{det. Alg} & \longrightarrow \text{"Algorithms" we usually see.} \\ \text{non-det. Alg} & \end{cases}$



$M$  is a (det) alg if  $M$  is a det. TM and  $M$  halts on all input.

$P$  = the class of problems, each of which can be solved by a det. Alg runs in poly-time.

$P$  is a small subset of all solvable problems. roughly means "efficient".



$M$  is a nondet. TM.

$M$  has nondet. time complexity  $T(n)$  if, for any input  $w$  of size  $n$ ,  $M$  accepts  $w$ , then

$M$  accepts  $w$  on a run whose length is at most  $T(n)$ .

In this case, we call  $M$  a nondet. Alg with running time  $T(n)$ .

NP: The class of problems, each of which can be solved by a nondet. Alg whose running time is polynomial.

||

be accepted by a NTM with nondet. poly-time.

NP is a small subset of nondet. Algs.  
└ problems solvable by

So far, we have two classes of problems.

$P$  and  $NP$ .

Remark: ① they are classes of problems; NOT classes of algs. You can NOT say any alg is in  $P$ , you can NOT say any alg is  $NP$ .

② No. 1 open problem in CS:

$P == NP?$

(We don't know whether a problem solvable in nondet. poly-time can also be solvable in det. poly-time.)

③ This is why in the entire history of CS, we study "nondet." throughout. (Recall midterm).

④. In Quantum computing world,  $P = NP$ .