# Complexity Theory 

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Lecture 25
Counting

## Agenda

- examples of counting problems
- definition
- how hard are they?


## Examples

Deciding is easy, counting is hard

## Example (\#CYCLE)

Number of simple cycles

- cycle detection in linear time
- if $\# C Y C L E$ has a polynomial algorithm then $\mathrm{P}=\mathrm{NP}$


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## Example (GraphReliability)

$\frac{1}{2^{n}}$. number of subgraphs with a path from $s$ to $t$

## Example (Maximum likelyhood in Bayes nets)

Visible variables are V's of $\leq 3$ hidden variables.
What is the fraction of satisfying assignments with $x_{1}=1$ ?

- equivalent to \#SAT


## Definition

## Definition (\#P)

A function $f:\{0,1\}^{*} \rightarrow \mathbb{N}$ is in \#P if there is a polynomial-time TM $M$ and a polynomial $p$ such that $\forall x \in\{0,1\}^{*}$

$$
f(x)=\left|\left\{y \in\{0,1\}^{p(|x|)}: M(x, y)=1\right\}\right|
$$

- counting certificates
- or accepting paths


## Definition (FP)

A function $f:\{0,1\}^{*} \rightarrow \mathbb{N}$ is in FP if there is a deterministic polynomial-time TM computing $f$.

- efficeintly solvable counting


## Decision analog

Theorem $F P=\# P$

## Decision analog

Theorem

$$
\mathrm{FP}=\# \mathrm{P} \Longleftrightarrow
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Theorem

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\mathrm{FP}=\# \mathrm{P} \Longleftrightarrow \mathrm{P}=\mathrm{PP}
$$

## Completeness

## Definition

A function $f$ is \#P-complete if $f \in \# \mathrm{P}$ and for every $g \in \# \mathrm{P}$ we have $g \in \mathrm{FP}^{f}$

- \#SAT is \#P-complete


## Completeness

## Definition

A function $f$ is $\# \mathrm{P}$-complete if $f \in \# \mathrm{P}$ and for every $g \in \# \mathrm{P}$ we have $g \in \mathrm{FP}^{f}$

- \#SAT is \#P-complete

Example (Determinant)
$\operatorname{det}(A)=\sum_{\sigma \in S_{n}} \operatorname{sgn}(\sigma) \prod_{i=1}^{n} A_{i, \sigma(i)}$

- computable in polynomial time

Example (Permanent) $\operatorname{perm}(A)=\sum_{\sigma \in S_{n}} \quad \prod_{i=1}^{n} A_{i, \sigma(i)}$

- \#P-complete (for 0,1 matrices) [Valiant'79]
- hence perm $\in \mathrm{FP} \Longrightarrow P=N P$


## Toda's theorem

## Theorem (Toda'91)

## PH $\subseteq \mathrm{P}^{\# S A T}$

Proof idea

- randomized reduction from PH to $\oplus S A T$ (odd number of satisfying assignments; $\oplus \mathrm{P}$-complete problem)
- derandomization


## What have we learnt?

- counting seems harder than deciding
- \#P-complete problems arise from NP-complete problems as well as from those in $P$
- more powerful than alternating quantifiers
- classes PP and $\oplus P$ : most and least significant bits of $\# P$ function

