## 高级算法设计与分析

■ **任课教师**: 孙晓明,蔡少伟,夏盟佶,田 国敬

■ 时间安排:

■ 第**1-5**周: 孙晓明

■ 第6-10周: 蔡少伟

■ 第11-15周: 夏盟佶

■ 第16-19周: 田国敬



## Randomized Algorithm

#### 孙晓明

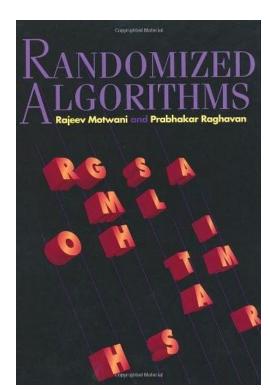
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《Randomized Algorithms》

■ 第1, 3, 4, 7, 14章





## 1. Probability

## **Birthday Paradox**



2022 1



1月						
26	27	28	29	30	31	1
2	3	4	5	6	7	8
9	10	11	12	13	14	15
16	17	18	19	20	21	22
23	24	25	26	27	28	29
30	31	1	2	3	4	5

2月						
30	31	1	2	3	4	5
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	1	2	3	4	5

27	28	1	2	3	4	5
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	29	30	31	1	2

<b>4</b> J.	ı					
27	28	29	30	31	1	2
3	4	5	6	7	8	5
10	11	12	13	14	15	1
17	18	19	20	21	22	2
24	25	26	27	28	29	3

1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31	1	2	3	4

<b>6</b> J						
29	30	31	1	2	3	4
5	6	7	8	9	10	1
12	13	14	15	16	17	1
19	20	21	22	23	24	2
26	27	28	29	30	1	2



8月						
31	1	2	3	4	5	6
7	8	9	10	11	12	13
14	15	16	17	18	19	20
21	22	23	24	25	26	27
28	29	30	31	1	2	3

28 29 30 31 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30 1

11月





30 31 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30 1 2 3

11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26 27 28 29 30 31

N = 23, Pr > 0.5



■ N=23, Pr(有两人同一天生日) =1-(1-1/365)(1-2/365)...(1-22/365)=0.507297

■ N=88, Pr(有三人同一天生日) > 0.5



## Two envelopes problem







要不要换?

1/2\*250+1/2\*1000=**625** 



## **Monty Hall Problem**





要不要换?

1/2? 2/3?





# 2. The Power of Randomized Algorithms



## **Equality Test**

$$x = y$$
?







Cloud storage: Dropbox, icloud...

Deterministic alg:  $\Theta(n)$ 













$$f(z) = x_0 + x_1 z + ... + x_n z^n$$

$$g(z) = y_0 + y_1 z + ... + y_n z^n$$

$$z \in \mathbf{F}_p (n^2 \le p < 2n^2)$$



$$z_0, f(z_0)$$



$$I_{[g(z_0)=f(z_0)]}$$

$$x \in \{0,1\}^n$$

$$y \in \{0,1\}^n$$



#### Error

= 
$$\Pr(f(z_0) = g(z_0) | x \neq y)$$

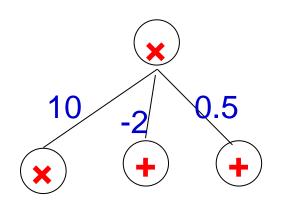
= Pr 
$$(z_0$$
 is a root of  $f(z)$ -g $(z)$  = 0)

= Pr 
$$(z_0 \text{ is a root of } c_0 + c_1 z + \dots + c_n z^n = 0 \text{ mod } p)$$

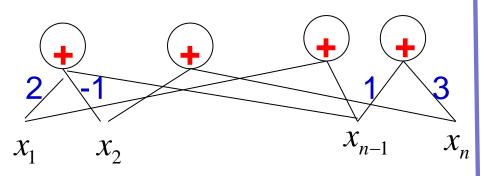
$$\leq \frac{n}{p} \leq \frac{1}{n}$$

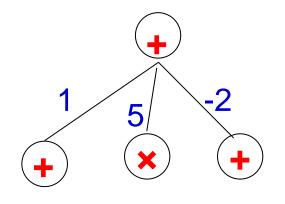
 $(c_i = x_i - y_i)$ 

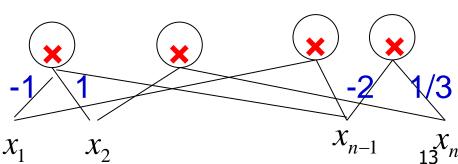
## **Polynomial Identity Testing**













## Polynomial Identity Testing(2)

• 
$$f(x) = (2x_1 - x_2)(x_3 - x_4 + 1) \dots (x_{n-1} - 2x_n) + \dots$$

$$g(x) = (x_1 + x_3)(x_2 - x_4 + x_7) \dots (x_{n-3} + 2x_{n-4} - x_n) + \dots$$

$$(a_1^2 + a_2^2 + a_3^2 + a_4^2)(b_1^2 + b_2^2 + b_3^2 + b_4^2)$$

$$= (a_1b_1 - a_2b_2 - a_3b_3 - a_4b_4)^2 + (a_1b_2 + a_2b_1 + a_3b_4 - a_4b_3)^2$$

$$+ (a_1b_3 - a_2b_4 + a_3b_1 + a_4b_2)^2 + (a_1b_4 + a_2b_3 - a_3b_2 + a_4b_1)^2$$

$$(x + y + z)^7 - (x^7 + y^7 + z^7)$$

$$= 7(x + y)(y + z)(z + x)[(x^2 + y^2 + z^2 + xy + yz + zx)^2 + xyz(x + y + z)]$$

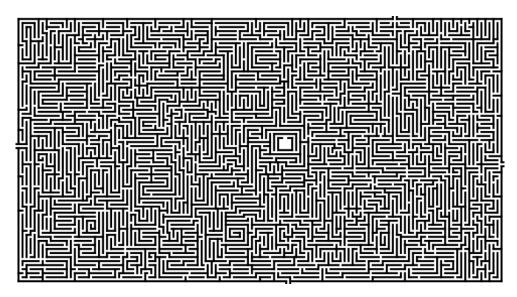


### Schwartz-Zippel lemma

Let  $P(x_1,x_2,...,x_n)$  be a polynomial of degree d over a field F. Let S be a finite subset of F and let  $r_1, r_2, ..., r_n$  be selected randomly from S, then

**Pr** 
$$(P(r_1, r_2, ..., r_n) = 0) \le d / |S|$$



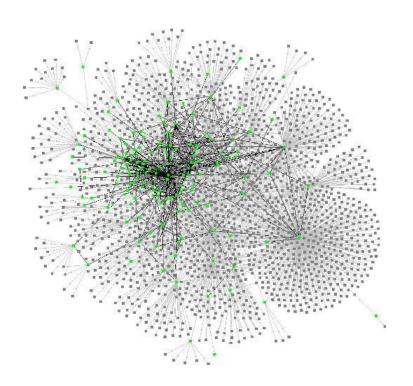


w.h.p. random walk with  $O(n^2)$  steps will visit every corner





## Counting

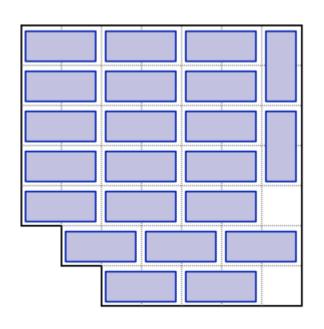


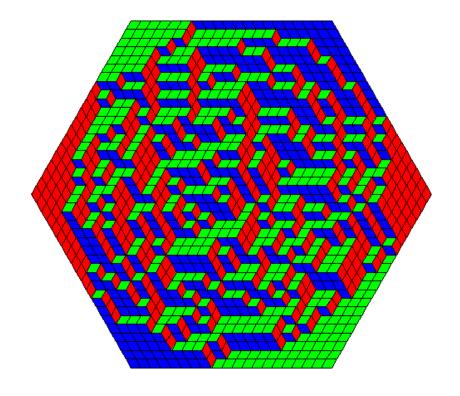




## Counting(2)

Domino tiling





**Markov-Chain Monte-Carlo Method** 



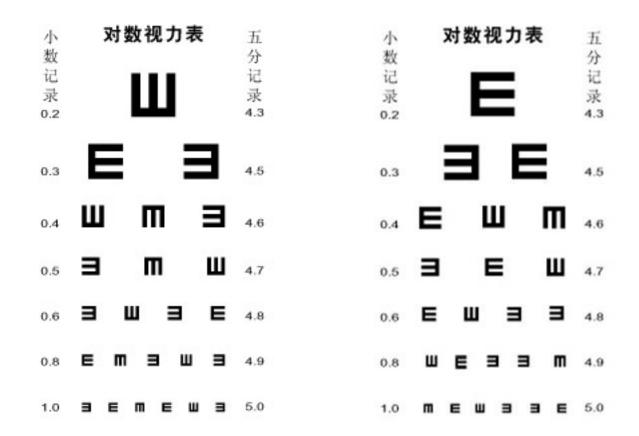
### Zero Knowledge



2012 Turing Awards: Goldwasser, Micali

Goldwasser and Micali's work helped make cryptography a precise science. The mathematical structures they created, including formal notions of privacy, adversaries, pseudorandomness, interactive proofs, zero-knowledge proof, and ..., set cryptography on rigorous foundations of the highest standards ...

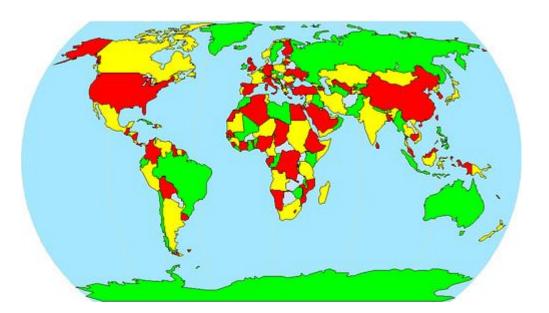
## Zero Knowledge(2)



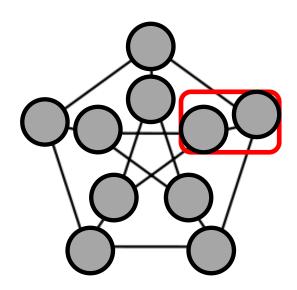


## Zero Knowledge(3)

■ 4-coloring



3-coloring?





# 3. Pseudorandomness (Limitation of Randomized Algorithms)















Pi = 3.1415926535 8979323846 2643383279 5028841971 6939937510 5820974944 5923078164 0628620899 8628034825 3421170679 8214808651 3282306647 0938446095 5058223172 5359408128 4811174502 8410270193 8521105559 6445229489 5493038196 4428810975 6659334461 2847564823 3786783165 2712019091 4564856692 3460348610 4543266482 1339360726

Every digit (e.g. 7) occurs 1/10 of the time Every pair (e.g. 99) occurs 1/100 of the time Every triple (eg 666) occurs 1/1000 of the time... (Conjectured)

3344685035 261931 881 7101000313 7838752886 5875332083 8142061717 669147303 5982534904 2875546873 1159562863 8823537875 9375195778 1857780532 1712268066 1300192787 6611195909 2164201989 ......

#### Prime number looks random

Copeland–Erdős constant:
 0.2357111317192329313741434753596167... is normal

Green-Tao Theorem: 5, 11, 17, 23, 29
 the sequence of prime numbers contains arbitrarily long arithmetic progressions

Twins Prime Conjecture:

There are infinitely many primes p such prime

Weaker Twins Prime Theorem (张



#### **Riemann Hypothesis**

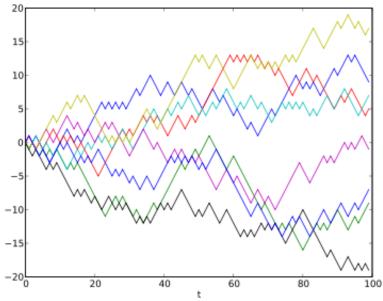
■ 
$$Pr(\uparrow) = Pr(\downarrow) = 1/2$$

$$|\sum_{i=1}^{N} x_i| \approx \sqrt{N}$$



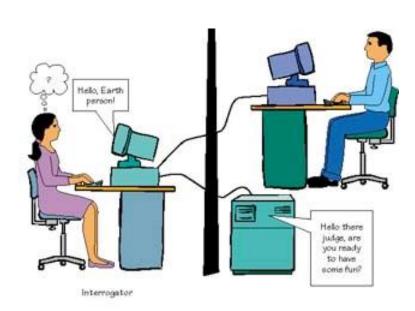
- Riemann Hypothesis
- $|\sum_{x \le N} \mu(x)| \approx \sqrt{N}$

are equivalent!!



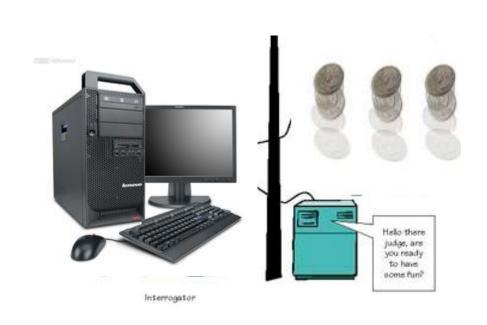
( $\mu$ (): Möbius function)

## **Turing Test**





#### **Pseudorandom Generators**





polynomial time alg. A



#### polynomial time alg. A

#### perfect coins



 $(1/2+1/2^n)$ -coins













- If #random coins =  $O(\log n)$ 
  - Polynomial time

- [Impagliazzo, Wigderson] P = BPP if E requires exponential circuits
  - derandomization

## 计算所量子计算与算法理论实验室

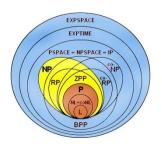
http://theory.ict.ac.cn

#### **Algorithm & Complexity Group**

The mission of the group is to develop knowledge and seek truth in the field of theoretical computer science as well as to train the talents of students. We are interested in the design of algorithms and analysis of the computational complexity for many problems abstracting from the issue in our real life. The current research area includes model and algorithm design in social network, algorithmic game theory, combinatorial optimization, graph theory, online algorithm, quantum computing, communication complexity, decision-tree complexity, etc.

Currently, the group contains 4 faculty members (including 1 professor and 3 associate professors), 2 affiliated faculty members and 9 students. The group enjoys frequent visits by well-known scientists from all over the world each year. A small number of visitors for a longer period of time are also available. For more detailed information about our academic exchange, please refer to ref <a href="sigma.ict.ac.cn">sigma.ict.ac.cn</a>. In addition, the group also works in close collaboration with other universities and research centers such as Tsinghua University, Microsoft Research Asia, and so on. With a vibrant research environment, the group is on its way to become an outstanding group on theoretical computer science.

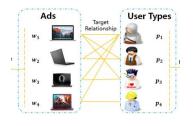




complexity



quantum computing



online algorithms



social networks



game theory







# 谢谢!