

DM551

# Algorithms and Probability

Joan Boyar

September 3, 2018

# Format

- ▶ Lectures (in English)
  - ▶ Joan Boyar
  - ▶ Joan's office hours:  
Mondays 9:00–9:45, Thursdays 9:00–9:45
  - ▶ Questions in English or Danish
- ▶ Discussion sections
  - ▶ Kristine Vitting Klinkby Knudsen

# Course exam

- ▶ Oral exam in January
- ▶ 2 exam assignments
  - ▶ 1st: you may work in groups of up to 3
  - ▶ 2nd: you must do it alone

# Assignments

- ▶ no working with others not in your group (talk with me or Kristine)
- ▶ no late assignments (count as not done)
- ▶ turn in via Blackboard – 1 PDF file
- ▶ grading – count towards final grade with January exam

# Assignments

- ▶ Begin early
- ▶ Ask if you do not understand
- ▶ Short, clear answers, but explain
- ▶ Do not reinvent the wheel –  
it is fine to make minor modifications to something from the textbook, just give a reference
- ▶ There are notes on how to write proofs on the course homepage

# Discussion sections

- ▶ Read notes/textbook sections  
When asked to prepare before coming, prepare
- ▶ Think about problems
- ▶ Prepare at least one problem to present

# Course Topics:

- ▶ Algorithm design and analysis
  - ▶ Randomized algorithms
  - ▶ Probabilistic analysis of algorithms
  - ▶ Linear recurrence relations
  - ▶ Universal hashing
  - ▶ String matching
- ▶ Combinatorics and probability
  - ▶ Counting techniques
  - ▶ Discrete probability

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Answer: There is a 1-1 correspondence between these subsets and the bit strings of length  $n$ , so  $2^n$ .

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- ▶ Tree diagrams.

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**Pf.** Suppose no hole contains  $> \lceil N/k \rceil - 1$  pigeons. Then, the number of pigeons is

$$\leq k(\lceil N/k \rceil - 1) < k((N/k + 1) - 1) = N.$$

Contradiction. So  $\geq 1$  hole has  $\geq \lceil N/k \rceil$  pigeons.  $\square$

## Examples:

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Suppose  $B \subset A$ ,  $|B| = 5$ . Must there be 2 integers in  $B$  which sum to 9?

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Yes. 3, 19, 13, 7, 12, 8, 4, 9, 29, 31, 2, 16, 1, 15, 21, 5, 6.

3, 7, 8, 29, 31. With  $n^2 + 1$  elements, must have  $n + 1$  increasing or decreasing. ( $n = 4$ ,  $n + 1 = 5$ ,  $n^2 + 1 = 17$ .)

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Suppose  $A$ ,  $B$ , and  $C$  are friends of  $P$ . If any pair are friends, we have a subset of 3 friends. If they are all enemies, they form a subset of 3 enemies.

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$R(m, n)$  number needed to ensure at least  $m$  friends or  $n$  enemies.