

# Programming Challenges

## Week 4 - Combinatorics

Claus Aranha

caranha@cs.tsukuba.ac.jp

College of Information Sciences

2015-05-11

Last updated May 8, 2015

# What is Combinatorics?

Combinatorics is the mathematics of counting.

Sounds easy, right?

- It begins with easy concepts: How to add or multiply groups;
- But in the end, it involves insight and advanced mathematics;
- It is very useful to simplify complex problems, and to estimate the size of sequences or combinations;

# Main definitions in combinatorics

## Sequence

$$S(1) = 1 = 1$$

$$S(2) = 1 + 2 = 3$$

$$S(3) = 1 + 2 + 3 = 6$$

# Main definitions in combinatorics

## Recurrence

The recursive form of a sequence:

$$S(n) = S(n-1) + n; S(1) = 1;$$

## Closed Form

The non-recursive form of a sequence:

$$S(n) = \frac{n(n+1)}{2}$$

The key in combinatoric problems is usually finding out the **recurrence**, or the **closed form** of a sequence.

# Combinatorics: What is it good for?

- Of course, some problems are simply to find the recurrence or the closed form of a sequence, or to find a specific value (eg. what is  $F(300)$ ?)
- But understanding recurrences is important to get an **intuition about the size of things**. You can look at a computational problem and understand how big it can get.

An intuition in combinatorics is essential to obtain an intuition in computational complexity.

# Warmup: Basic Combinatoric techniques

These basic rules are used to derive many of the most advanced combinatoric constructs.

## Product Rule

*You have 4 shirts and 5 pants. How many different ways can you get dressed?*

- **Product Rule:** We want to combine one element from set  $A$ , and one element from set  $B$ . There are  $|A| \times |B|$  different possibilities.

# Warmup: Basic Combinatoric techniques

These basic rules are used to derive many of the most advanced combinatoric constructs.

## Sum Rule

*The university restaurant has 3 types of curry, 5 types of noodles and 4 types of pasta. How many days does it take to eat one of each type of food?*

- **Sum Rule:** We want to choose one element from either set  $A$  or set  $B$ . Assuming the sets are independent, there are  $|A| + |B|$  possibilities.

# Warmup: Basic Combinatoric Techniques

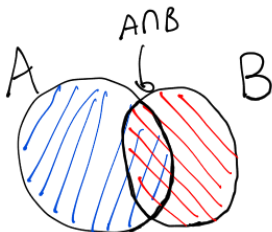
## Intersection and Double Counting

*15 students like chocolate. 13 students like vanilla. 5 of these students like both. How many students are there?*

To combine sets that have repeated elements, we have to **exclude** elements that have been counted twice, and **include** elements that have been removed twice.

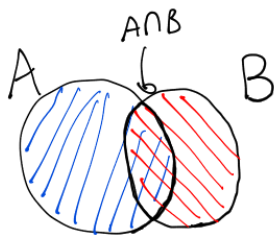


# Intersection of sets (2)



How do we count the elements of two intersecting sets?

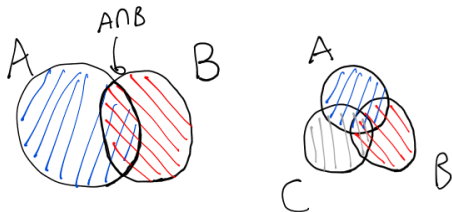
## Intersection of sets (2)



How do we count the elements of two intersecting sets?

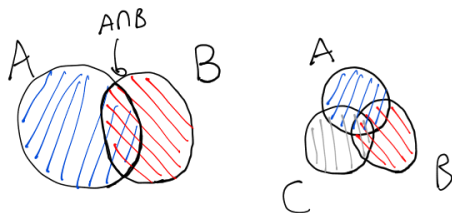
$$|A \cup B| = |A| + |B| - |A \cap B|$$

# Intersection of sets (3)



How do we count the elements of **three** intersecting sets?

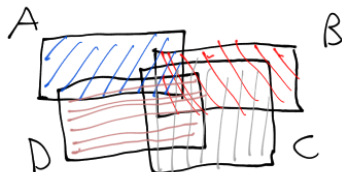
# Intersection of sets (3)



How do we count the elements of **three** intersecting sets?

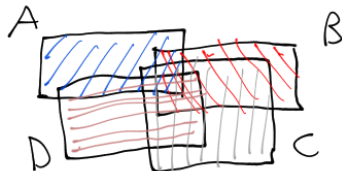
$$|A \cup B \cup C| = |A| + |B| - |A \cap B| + |C| - |A \cap C| - |B \cap C| + |A \cap B \cap C|$$

# Intersection of sets (4)



How do we count the elements of **four** intersecting sets?

# Intersection of sets (4)



How do we count the elements of **four** intersecting sets?

$$|A \cup B \cup C \cup D| = |A| + |B| + |C| + |D| - |A \cap B| - |A \cap C| - |A \cap D| - |B \cap C| - |B \cap D| - |C \cap D| + |A \cap B \cap C| + |A \cap B \cap D| + |A \cap C \cap D| + |B \cap C \cap D| - |A \cap B \cap C \cap D|$$

This grows exponentially!

# What is this useful for?

Calculating set sizes is essential when estimating how fast a combination can grow!

- Combination sets;
- Problem cases – how many possibilities for the input/output?
- Algorithm complexity – how many combinations of loops?
- Mathematical Proofs – proof by induction!
- Etc. . .

# Permutations

## Permutations

Arrangement of  $n$  items, where every item appears exactly once:

123,132,213,231,312,321

## Where do we see them?

- Travelling salesman – output is the permutation of cities in the order that they should be visited.
- Can you give me another example?



# Permutations

## Permutations

Arrangement of  $n$  items, where every item appears exactly once:

123,132,213,231,312,321

How many permutations exist for  $n$ ?

# Permutations

## Permutations

Arrangement of  $n$  items, where every item appears exactly once:

123,132,213,231,312,321

How many permutations exist for  $n$ ?

- $n!$
- $3! = 6$
- $10! = 3628800$
- $20! = 2.432 \times 10^{18}$

# Subsets

## Subsets

A selection of  $n$  items, where each item can exist or not:

$\{1\}, \{2\}, \{3\}, \{1,2\}, \{1,3\}, \{2,3\}, \{1,2,3\}, \{\}$

## Where do we use them?

- The backpack problem – Select the items that fit in the backpack.
- Can you give me another example?

# Subsets

## Subsets

A selection of  $n$  items, where each item can exist or not:

$\{1\}, \{2\}, \{3\}, \{1,2\}, \{1,3\}, \{2,3\}, \{1,2,3\}, \{\}$

How many subsets are there for  $n$ ?

# Subsets

## Subsets

A selection of  $n$  items, where each item can exist or not:

$\{1\}, \{2\}, \{3\}, \{1,2\}, \{1,3\}, \{2,3\}, \{1,2,3\}, \{\}$

How many subsets are there for  $n$ ?

- $2^n$
- $2^3 = 8$
- $2^{10} = 1024$
- $2^{20} = 1048576$

# Strings

## Strings

A sequence of elements draw from a set **with repetition**.  
string of length 3 from {123}: 222, 321, 121, ...

## Where do we see them?

- Game moves (e.g. Prisoner's Dilemma)
- Other examples?

# Strings

## Strings

A sequence of elements draw from a set **with repetition**.

string of length 3 from  $\{123\}$ : 222, 321, 121, ...

How fast do they grow?

# Strings

## Strings

A sequence of elements draw from a set **with repetition**.

string of length 3 from {123}: 222, 321, 121, ...

## How fast do they grow?

- $m^n$
- $26^5 = 11881376$
- $10^{10} = 10000000000$



# Recurrence Relations

## Definition

A Recurrence Relation is a function defined in terms of itself.  
Recursion – Recurrence – Related words.

## Can you see the recursion?

- Tree – A tree has  $n$  children, which can be leaf nodes or other trees
- List –
- Divide-and-conquer –
- Other examples?

# Recurrence Relations

## Definition

A Recurrence Relation is a function defined in terms of itself.  
Recursion – Recurrence – Related words.

## Can you see the recursion?

- **Tree** – A tree has  $n$  children, which can be leaf nodes or other trees
- **List** – an item links to null, or to another List
- **Divide-and-conquer** – Divide the data, and apply the algorithm to each part
- Other examples?

# Recurrence Relations

## Why are recurrences important

If we can find the recurrence in a sequence or in a set, we have found a **simple algorithm** to build that sequence or set.

Recurrences are specially important for **Dynamic Programming** (which we will talk about in a future class).

# Recurrence Relations

## Components of a Recurrence Relation

- Starting Condition;
- Recurrence Step;

## Example: The Fibonacci Numbers

- Starting Condition:  $F(0) = 0; F(1) = 1;$
- Recurrence step:  $F(n) = F(n - 1) + F(n - 2)$

## Curiosity

The Fibonacci numbers were created to model the multiplication of rabbits.

# Recurrence Relations

Many functions can be easily expressed as recurrences:

- Degrees from polynomials;

$$a_n = a_{n-1} + 1; a_1 = 1;$$

- Exponential ( $f(k, n) = k^n$ );

$$f(k, n) = k * f(k, n - 1); f(k, 0) = 1;$$

- Factorial ( $f(n) = n!$ );

$$f(n) = n * f(n - 1); f(0) = 1;$$

# Closed Form of Recurrence Relations (1)

## Definition

The **closed form** of a recurrence relation is a formula that describes the result without using the recurrence.

$$F(n) = \frac{1}{\sqrt{5}} \left( \left( \frac{1 + \sqrt{5}}{2} \right)^n - \left( \frac{1 - \sqrt{5}}{2} \right)^n \right)$$

- Closed forms are useful to quickly calculate recurrences when  $n$  is very big;
- They can **remove** precision errors from repeated multiplications;
- They can **add** approximation errors for small  $n$ .
- Calculating closed forms is an art! (Or research topic)

# Closed Form of Recurrence Relations (2)

## Close Form for the Fibonacci Numbers

$$F(n) = \frac{1}{\sqrt{5}} \left( \left( \frac{1 + \sqrt{5}}{2} \right)^n - \left( \frac{1 - \sqrt{5}}{2} \right)^n \right)$$

## We can learn things from closed forms

The second term of the closed form is always between 0 and 1, so we can calculate only the first term to estimate the value of a Fibonacci number;

# Binomials

$$\binom{n}{k} = \binom{n-1}{k-1} + \binom{n-1}{k} = \frac{n!}{(n-k)!k!}$$

Very important combinatory sequence

**Basic Definition:** Number of ways you can make  $k$  choices from  $n$  elements.



# What can you count with binomials

- **Probabilities:** What are the probabilities of your 5 numbers being chosen from the 60 in the lotto?  $\frac{1}{\binom{60}{5}}$
- **Paths Across a Grid:** How many ways are there to go from the top right of a  $n \times m$  grid to the bottom left, with the smallest amount of steps?  $\binom{n+m}{n}$
- **Coefficients of  $(a + b)^n$ :** What is the coefficient of  $a^k b^{n-k}$ ? Answer:  $\binom{n}{k}$ . Can anyone explain why?

# Computing the Binomial

## Closed form of the binomial

$$\binom{n}{k} = \frac{n!}{(n-k)!(k!)}$$

- What is the problem if you try to calculate that formula in a program?

# Computing the Binomial

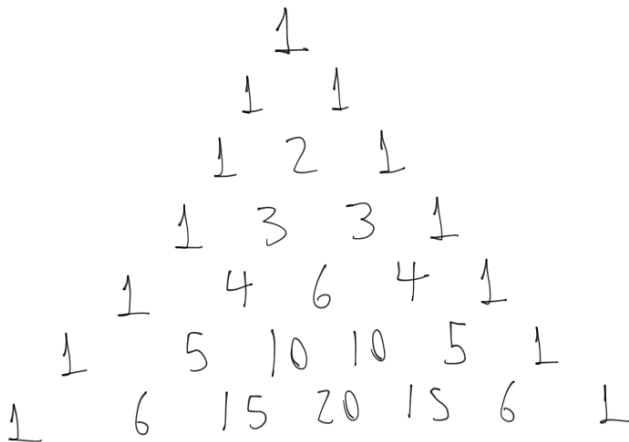
## Closed form of the binomial

$$\binom{n}{k} = \frac{n!}{(n-k)!(k!)}$$

- What is the problem if you try to calculate that formula in a program?
- Repeated multiplication can lead to overflow errors!

# Computing the Binomial

## Pascal's Triangle



Have you ever played with pascal's triangle?

# Computing the Binomial

What can we take from pascal's triangle?

- 1 Every number is the sum of its “parents”;
- 2 Every line  $n$  adds up to  $2^n$
- 3 The numbers of line  $n$  are the coefficients of  $(a + b)^n$

...wait!

We have seen 3 before elsewhere...

# Computing the Binomial

## Another way to see Pascal's Triangle

$$\begin{array}{cccc} & & & \binom{0}{0} \\ & & \binom{1}{0} & \binom{1}{1} \\ & \binom{2}{0} & \binom{2}{1} & \binom{2}{2} \\ \binom{3}{0} & \binom{3}{1} & \binom{3}{2} & \binom{3}{3} \end{array}$$

We know that each element of Pascal's triangle is the sum of its parents. This indicates that the same thing happens for binomials.

# Computing the Binomial

$$\binom{n}{k} = \binom{n-1}{k-1} + \binom{n-1}{k}$$

Let's think about the new element  $n$

- What happens if  $n$  is part of the sequence  $k$ ?
- What happens if  $n$  is NOT part of the sequence  $k$ ?
- What do we do with these two sets?

# Recursion and Induction

Induction and Recursion are closely related to recurrence relations. If we can find out a correct recurrence relation for a combinatorial construct, we can also derive a recursive algorithm, its induction, and maybe even its closed form!

## Calculating the Recursion

- Try to figure out what the base cases are;
- Plot a some of the smaller values;
- Observe these values for patterns;



# Catalan Numbers

$$C_n = \sum_{k=0}^{n-1} C_k C_{n-1-k} = \frac{1}{n+1} \binom{2n}{n}$$

1, 1, 2, 5, 14, 42, 132, ...

How many valid combinations there are for  $n$  pairs of parenthesis?  
For  $n = 3$ , we have 5:  $((()))$ ,  $()(())$ ,  $((())())$ ,  $((())())$  and  $()()()$ .

Can you derive the recurrence above using this information?

# Integer Partition

$$f(5, 5) = (5), (4, 1), (3, 2), (3, 1, 1), (2, 2, 1), (2, 1, 1, 1), (1, 1, 1, 1, 1)$$

$f(n, k)$  Number of ways that we can sum  $n$ , using integers equal or smaller than  $k$ . The recurrence is

$f(n, k) = f(n - k, k) + f(n, k - 1)$ , and the base cases are:

$f(1, 1) = 1$  and  $f(n, k) = 0; k > n$ . Can you derive this recurrence?

# This Week's Problems

- How Many Fibs
- Complete Tree Labeling
- Counting
- Steps

# Alert: About Week 5

## Alert for Week 5!

There will be no class on **5/18, 5/22, 5/25**. Week 5 only class will be on 5/29.

Because of this, you will have TWO WEEKS to solve week 5's problems (5/16 to 5/31). The lecture notes for week 5 will be online this Friday.