

Advanced Counting Techniques

CS1200, CSE IIT Madras

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April 7, 2020

Advanced Counting Techniques

- Principle of Inclusion-Exclusion ✓
- Recurrences and its applications
- Solving Recurrences

Recurrences

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- Fibonacci sequence
- Towers of Hanoi (reading exercise Example 2, Chapter 8)

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Today's class: Modeling a variety of problems having the same solution.

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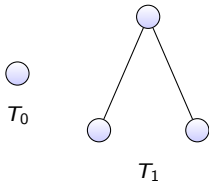
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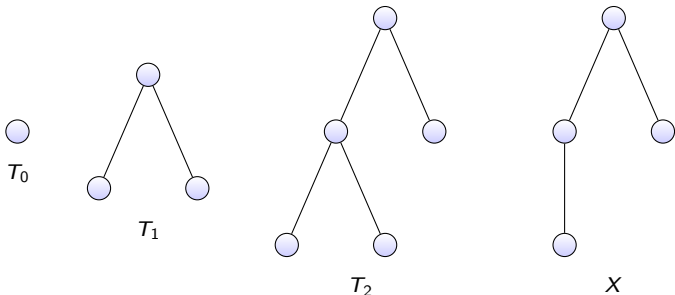
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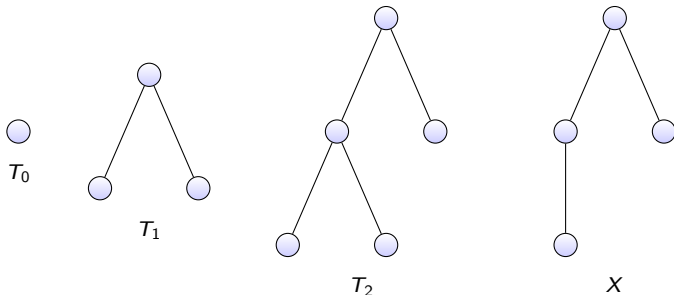
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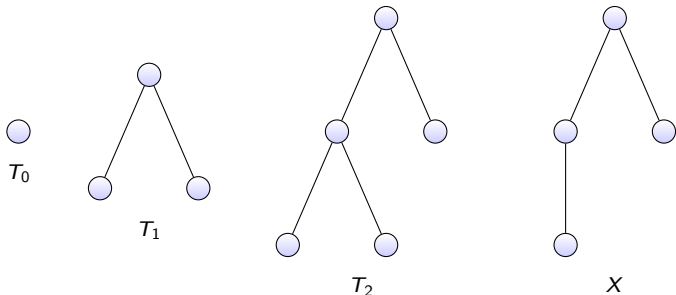


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- X is **not** a full binary tree.

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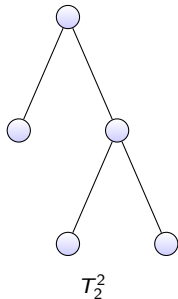
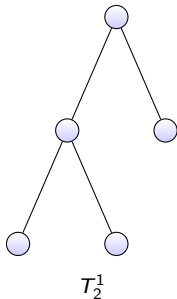
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- 2 internal nodes in left subtree and $n - 3$ internal nodes in right subtree.
This gives $f(2) \cdot f(n - 3)$ ways of constructing trees with n internal nodes.

⋮

- $n - 1$ internal nodes in left subtree and 0 internal nodes in right subtree.
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- Why is adding the terms valid?
 - What is a closed form expression for this recurrence?

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Base cases: $g(0) = 1$, $g(1) = 1$.

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Compare it with the recurrence for $f(n)$ earlier 

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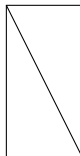
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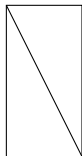
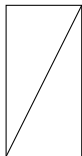
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Ex: Work out the recursive formulation for both the examples.

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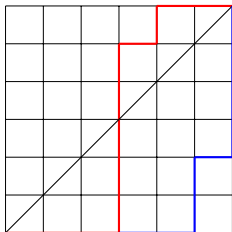
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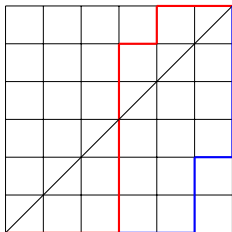
- Two paths – one red and another blue.
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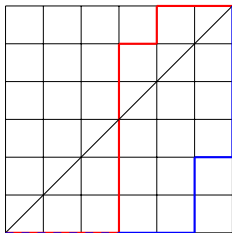
Goal: Compute total number of **valid paths**, that is, diagonal avoiding paths.

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- Each path contains n right steps (R) and n up (U) steps.
we have already solved this when there were no more constraints
- **Additional condition:** Paths should not cross the main diagonal.



- Two paths – one red and another blue.
- Red path is invalid.
(RRRUUUUURURR)
- Blue path is valid.
(RRRRRUURUUUU)

Goal: Compute total number of **valid paths**, that is, diagonal avoiding paths.

A first guess it to count all paths from $(0, 0)$ to (n, n) which is $\binom{2n}{n}$ and then claim that half of the total paths are diagonal avoiding.

Example 3: Diagonal Avoiding Grid Paths

Input: An $n \times n$ grid.

Goal: To compute number of **diagonal avoiding** paths from $(0, 0)$ to (n, n) , denote it by $h(n)$.

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In contrast every valid path satisfies the property that every prefix has at least as many Rs as the number of Us. Thus, every diagonal avoiding grid path is in one-to-one correspondence with a string of balanced parenthesis of length $2n$.

This is simply obtained by replacing every "(" by R and every ")" by U .

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- It has a prefix in which there are more Us than Rs. (that is why it crosses the diagonal!)
- Select the smallest such prefix. (RRRUUUU – in the above).

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- Keep the prefix of the path as it is and in the remaining path **flip** the Us and Rs. Call this the modified path.

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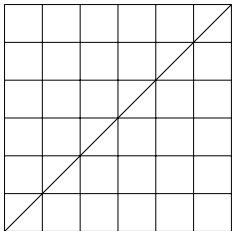
The trick in action.

invalid path (RRRUUUUURURR) → modified path RRRUUUURURUU

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- Note that the modified blue path follows the red path for the prefix part, and then flips it.

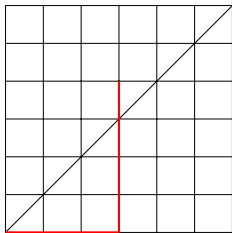
How does it help?

- Every modified path always ends in $(n - 1, n + 1)$.
revisit the previous slide and construct a proof!
- One to one correspondence between invalid paths and paths (no more constraints of diagonal avoiding) from $(0, 0)$ to $(n - 1, n + 1)$.
establish this correspondence!

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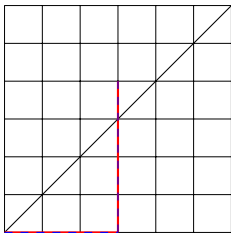
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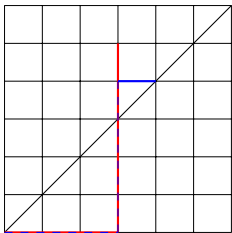
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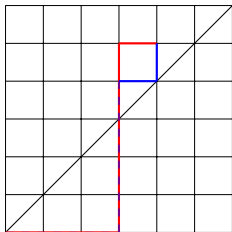
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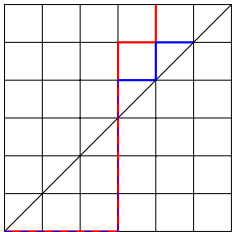
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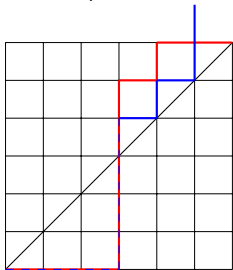
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Number of valid paths = $h(n) =$

$$\binom{2n}{n} - \binom{2n}{n+1} = \frac{1}{n+1} \binom{2n}{n}.$$

Catalan Number

The number $\frac{1}{n+1} \binom{2n}{n}$ is called the n -th Catalan number.

- Gives a closed form solution to several examples (seen today).
- Many more applications.
- References Section 8.1[KR].