

Lecture 23

Introduction to Dynamic Programming

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Let's learn DP through an example!

Rod Cutting

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Maximum profit

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Time Complexity: You can either **cut or not cut** at every **i th** inch. Generating all cuttings this way can lead to **$O(2^n)$** time.

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Let \textit{profit}_n = maximum profit obtainable from an n inches rod. Then,

If length of the first cut in optimal cutting is i , then $\textit{profit}_n = p[i] + \textit{profit}_{n-i}$

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For the remaining $(n - i)$ length rod,
we cannot get more than $profit_{n-i}$.

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$profit_n$ is maximum of these

A diagram consisting of several curved arrows pointing from the right-hand side of the equations above towards a common point. The arrows originate from the blue-highlighted expressions $p[1] + profit_{n-1}$, $p[2] + profit_{n-2}$, $p[3] + profit_{n-3}$, and $p[n]$. The arrows from the first three equations are solid black lines, while the arrow from $p[n]$ is a dashed black line. This visualizes the concept that $profit_n$ is the maximum of these values.

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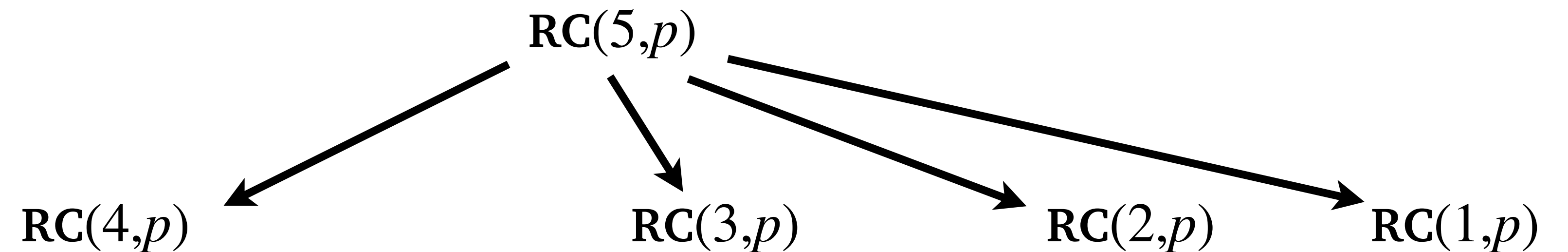
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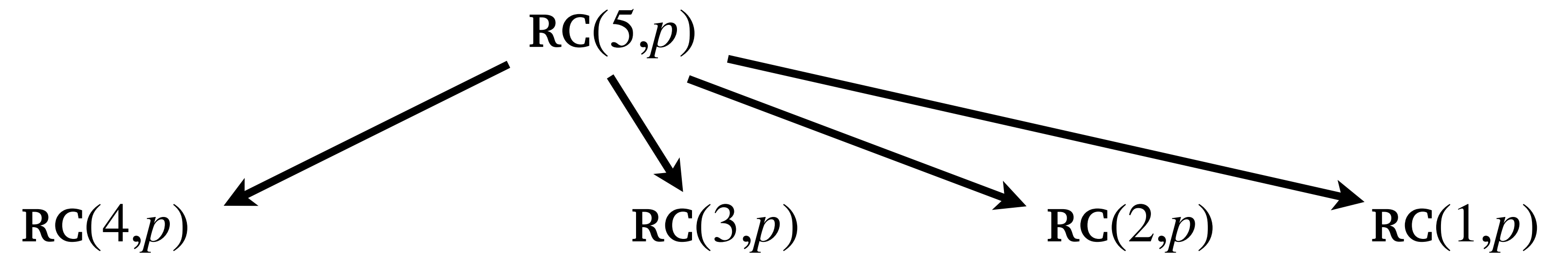
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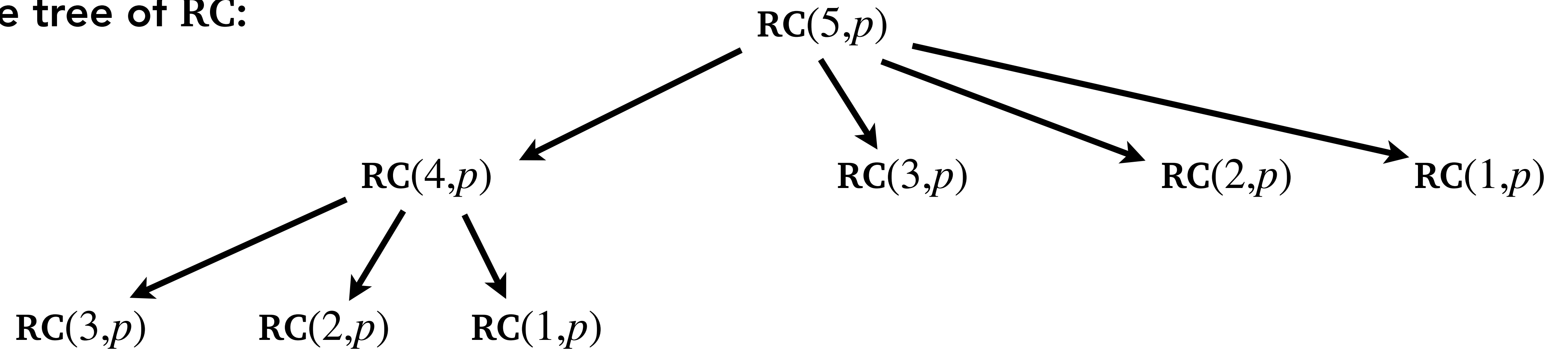
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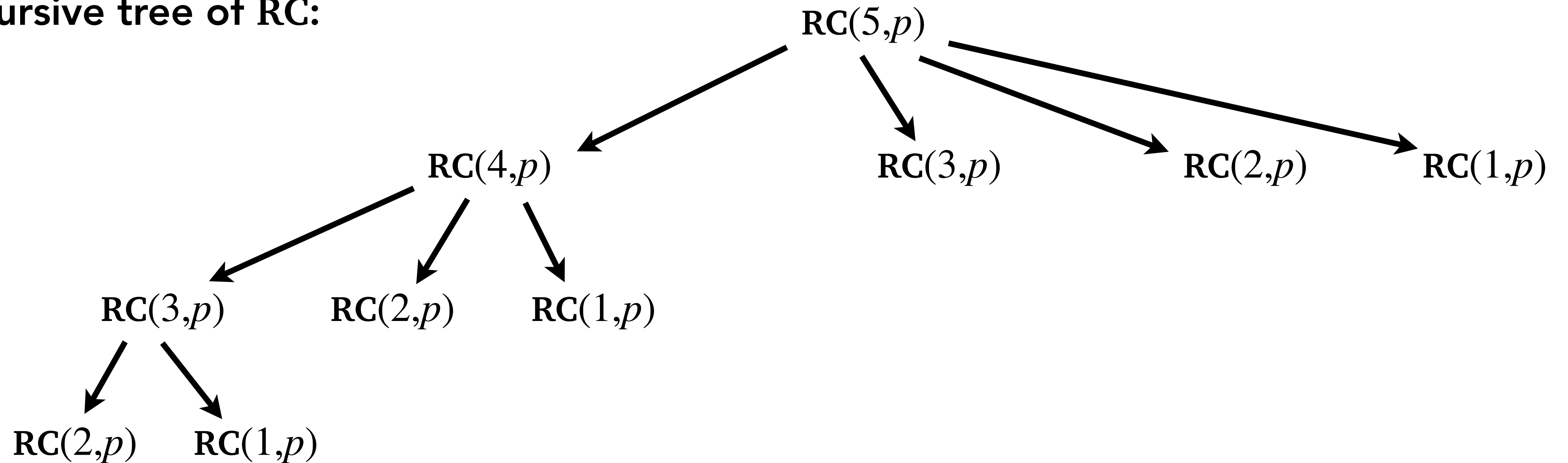
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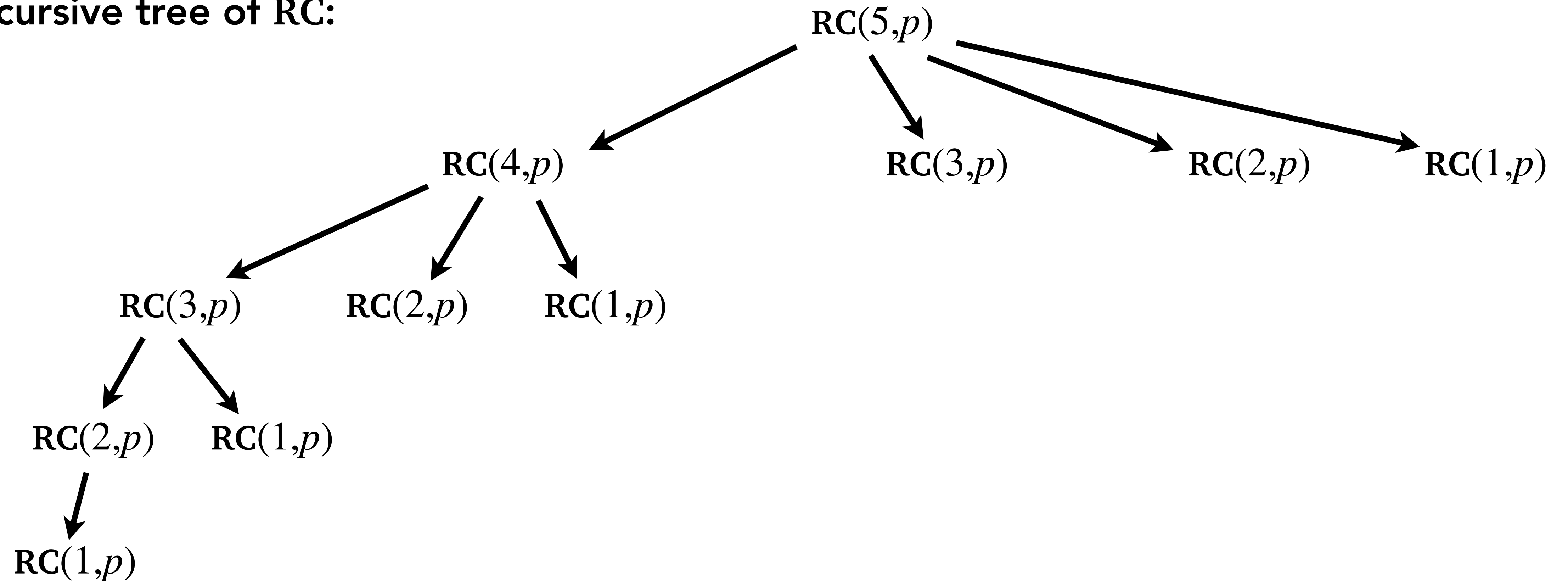
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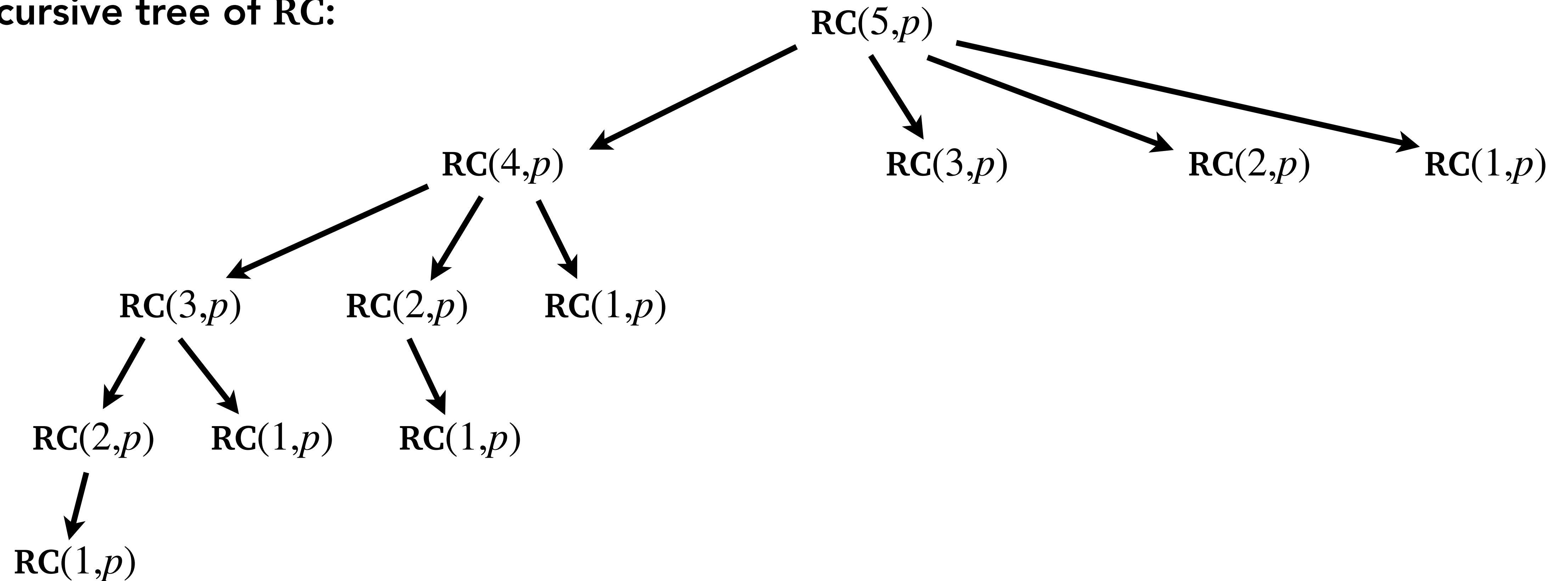
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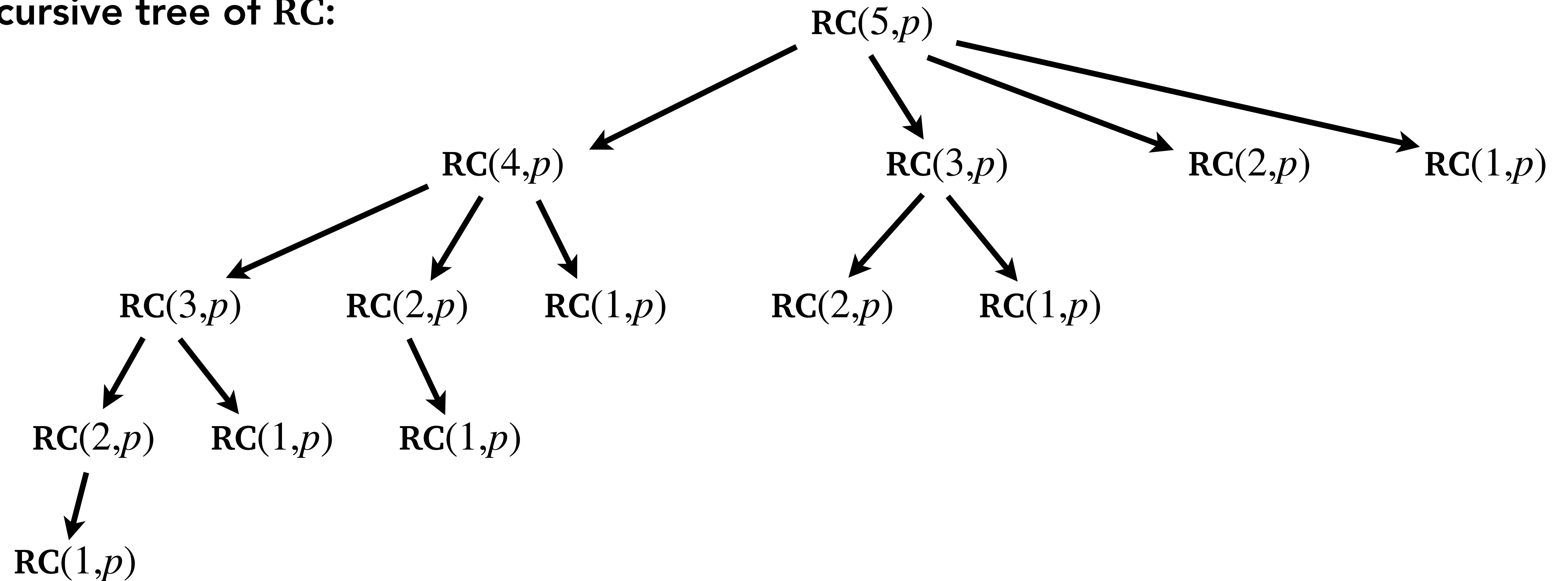
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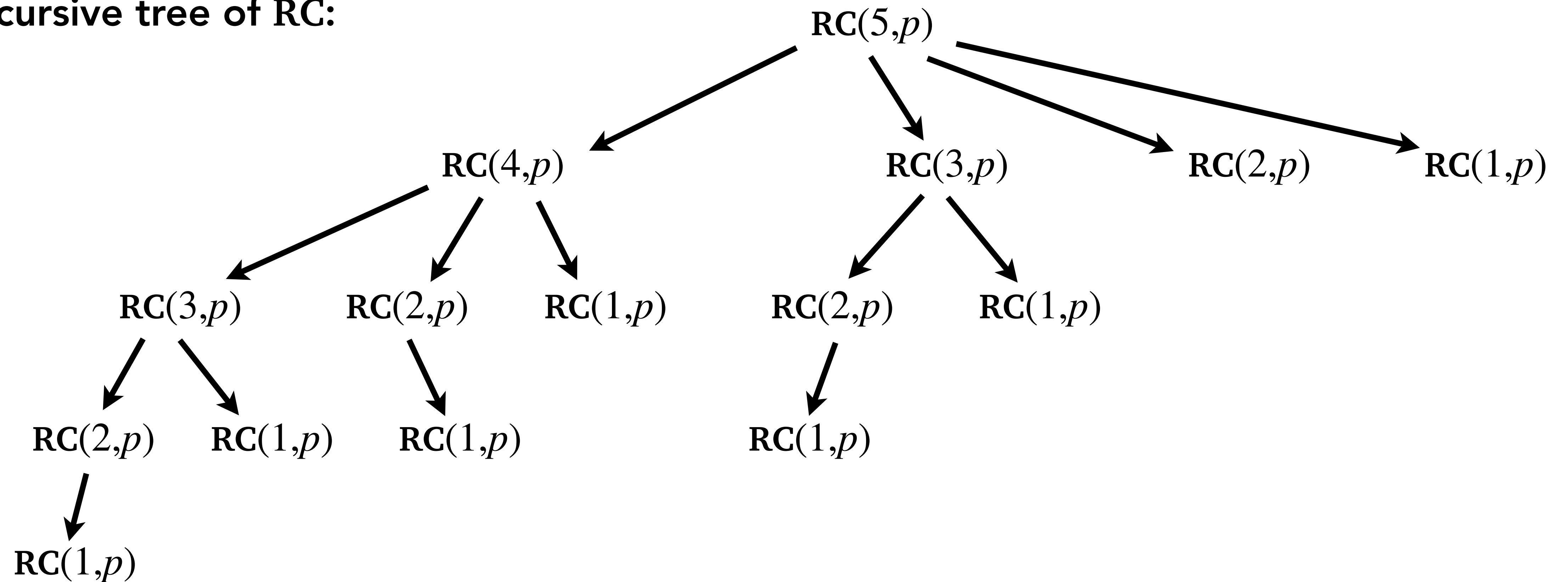
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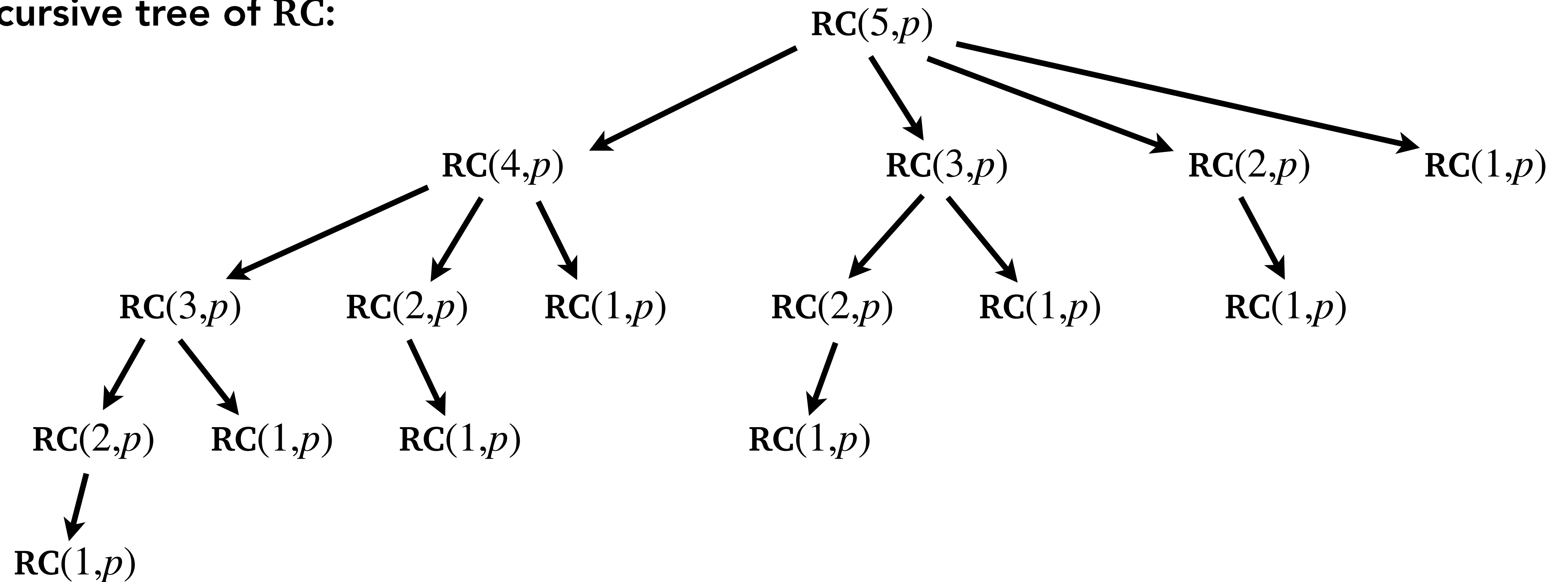
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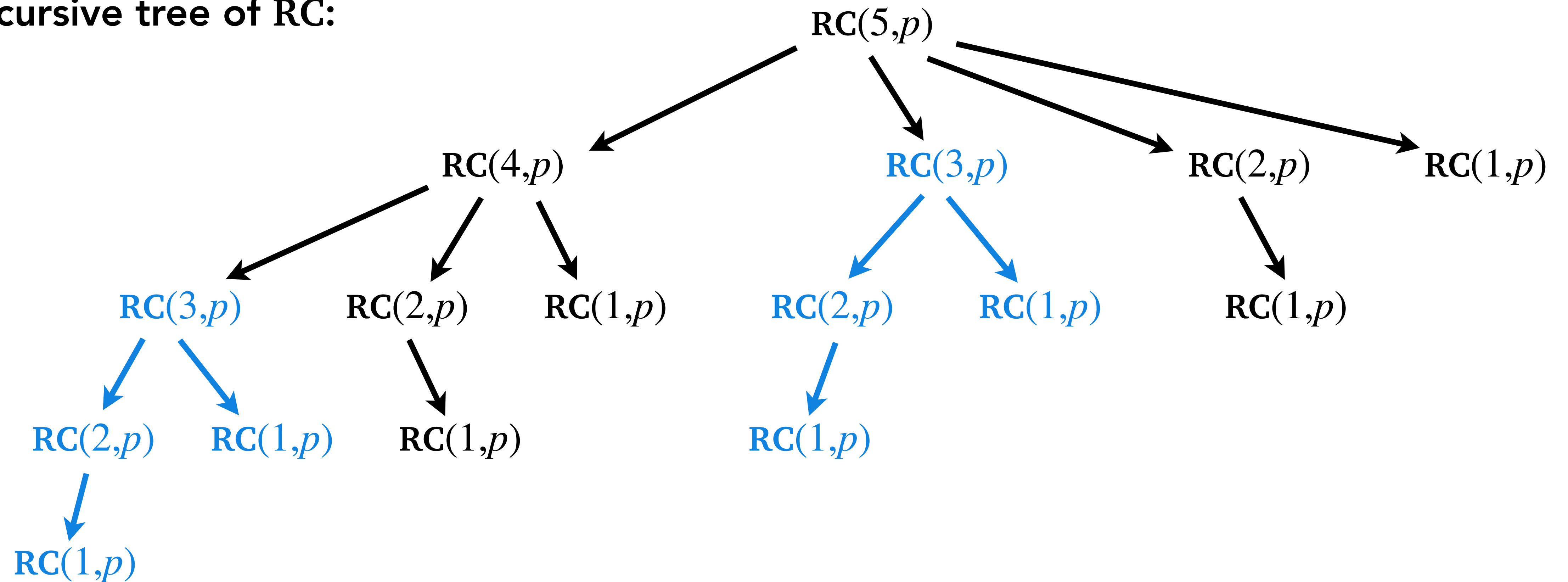
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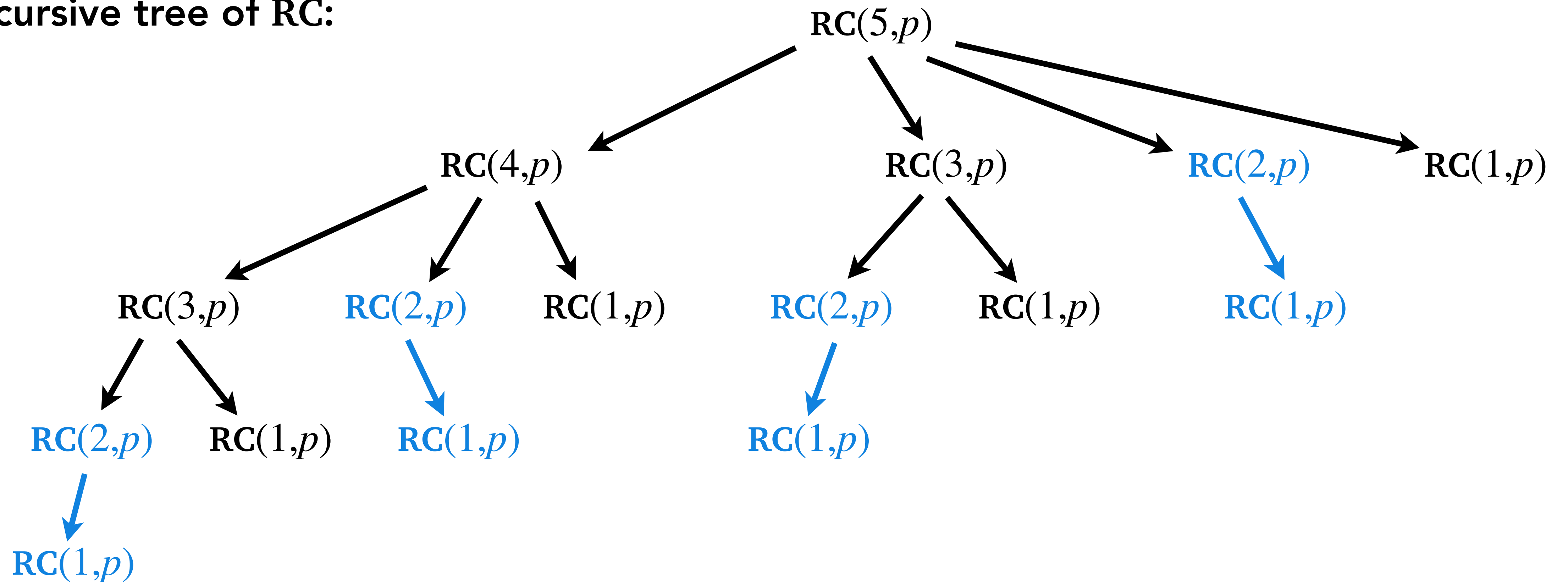
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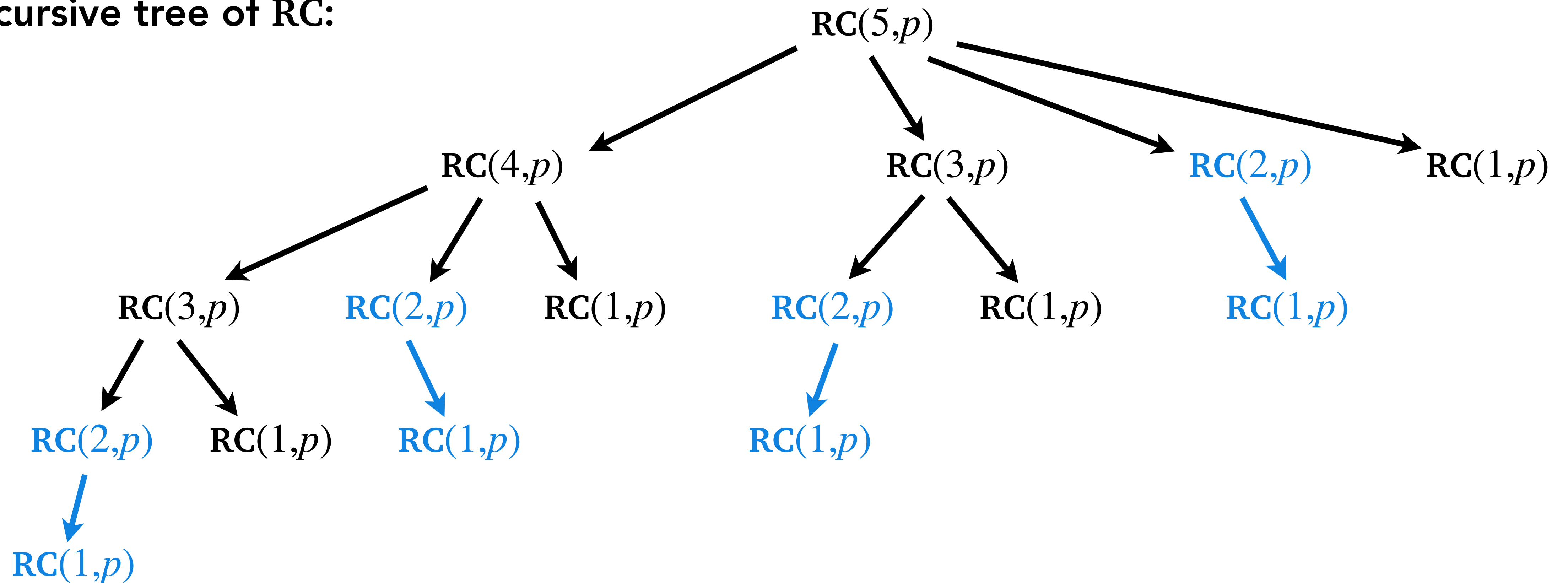
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Observation: $\text{RC}(3,p)$ and $\text{RC}(2,p)$ is getting computed from scratch multiple times.

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2) Store the maximum profit obtainable from an *i* length rod in *profit*[*i*] for future use

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- Idea:**
- 1) Define an array *profit*[1 : *n*]
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- Idea:** 1) Define an array $profit[1 : n]$
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$$profit[1 : n] = \{p[1], -1, \dots, -1\}$$

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profit[1 : *n*] = {*p*[1], − 1, ..., − 1} ←

RC(*n*, *p*):

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Profit of n length rod is already computed

Dynamic Programming Enters

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- 2) Store the maximum profit obtainable from an i length rod in $profit[i]$ for **future use** after calculating it the **first time**.

$profit[1 : n] = \{p[1], -1, \dots, -1\}$

$p[i] = -1$ means profit for
 i length rod is not computed yet

RC(n, p):

1. if $profit[n] \neq -1$
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Profit of n length rod is already computed

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Time Complexity of RC

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Time Complexity of RC

Let $T(n)$ denote the runtime of $\text{RC}(n, p)$

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Cost of line 1,2,3, & 6

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Cost of $\text{RC}(n - 1, p)$

Cost of line 1, 2, 3, & 6

Cost of for loop from $i = 2$ to $n - 1$
as $\text{RC}(n - i, p)$ will return immediately.

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$$= c' + \Theta(n) + c' + \Theta(n - 1) + c' + \Theta(n - 2) + c' + \Theta(n - 3) + \dots + c$$

$$= \Theta(n^2)$$