

# Lecture 2 – Recursion and Recurrence Relations: Methods and Implementation on the JVM

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# Recursion on the JVM

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Every method invocation creates a new stack frame; the per-thread call stack is finite. Sufficiently deep recursion can therefore terminate with a `StackOverflowError`.

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The HotSpot JVM does not guarantee tail-call optimization; tail-recursive routines should be refactored as iterative loops.

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Frequent calls and transient allocations (e.g., boxing, lambda captures) introduce overhead and increase GC activity. On hot paths, prefer primitive types and contiguous arrays.

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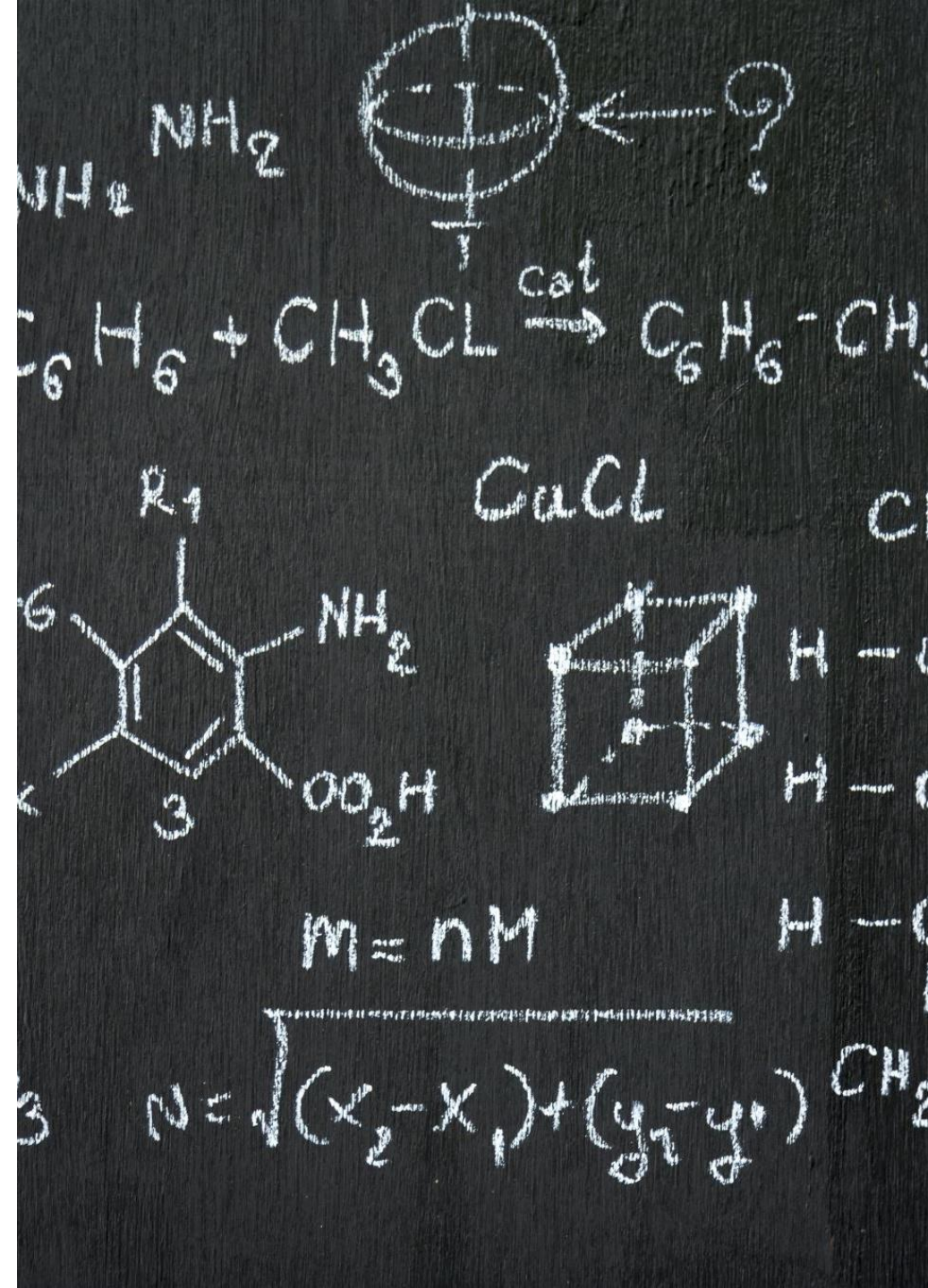
JIT inlining reduces call overhead for small methods, but it is not tail-call elimination and does not mitigate recursion depth.

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For inputs that may induce large depth (trees, graphs, QuickSort), use an explicit stack/queue or recurse only on the smaller partition to keep stack usage bounded (typically  $O(\log n)$ ).

# Recursion and Recurrence

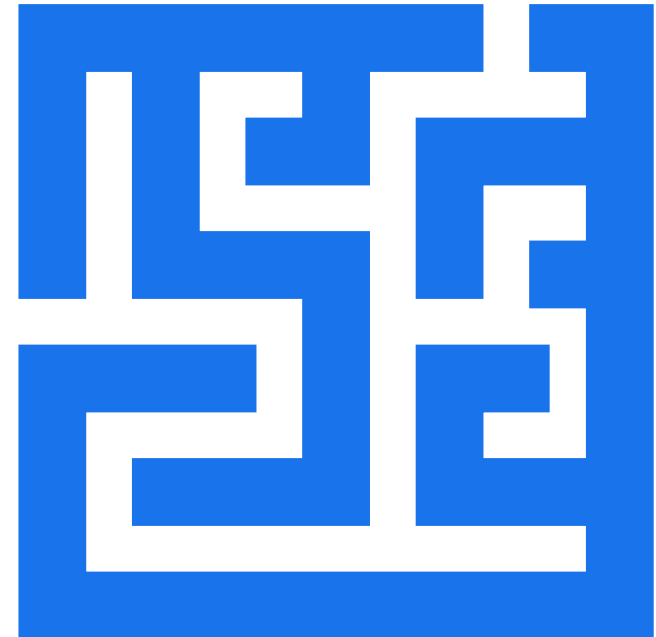
- **Recursion:** a procedure or function defined in terms of itself on smaller or simpler inputs, together with base cases that terminate the process.
- **Recurrence:** an equation that defines a sequence or function by referencing its own earlier values, plus initial conditions.
- **Recurrences for running time:** mathematical models of the cost of recursive algorithms.
- **Relationship:** recursion is a programming technique; a recurrence is a mathematical description (often of that program's behavior).



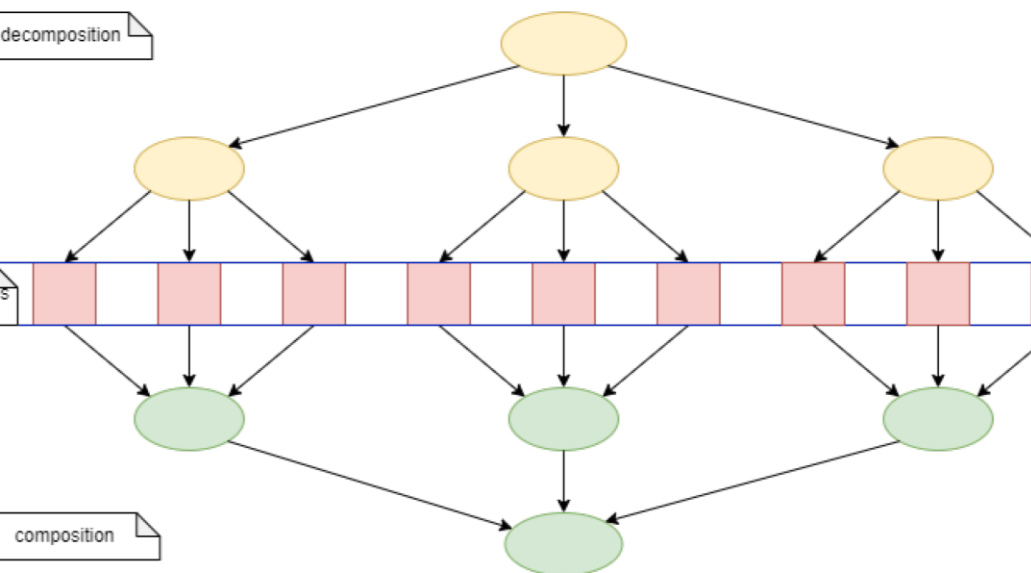
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# Tail-Call Elimination

- **When it applies.** Single recursive call in tail position; no work after the call; clear base cases.
- **Idea.** Lift the evolving state into parameters
- **Transform.** Pick accumulator → set initial value → replace the tail call with parameter updates → use a while guarded by the base condition → return the accumulator.
- **Soundness.** State a loop invariant and prove it by induction.
- **Cost model.** Same asymptotics; stack usage becomes constant; fewer call boundaries.
- **Where it shines.** factorial, running sums/scans, Euclid's gcd, linear traversals, simple linear recurrences.
- **Where it doesn't.** Branching recursion or any work after the call (e.g., combine left/right) → use D&C, an explicit stack, or DP.
- **JVM motive.** HotSpot does not promise tail-call optimization; loops are the portable, robust form.
- **Caveats.** Accumulator overflow, accidental boxing/allocations on hot paths, off-by-one bases.



decomposition



# Divide-and-Conquer Patterns

**Idea:** split problem → solve subproblems → combine; explicit **base cases**.

## Decompositions:

- Balanced binary:  $n \rightarrow (n/2, n/2)$
- Multiway: a subproblems of size  $n/b$
- Uneven:  $(n/3, 2n/3)$  “**smaller–larger**” (Example: QuickSort)
- Transform-and-conquer: reduce/transform, then solve (Example: Karatsuba, FFT)

**Combine step:** cost  $f(n)$ , example: merge/sum/min/max/partition; aim to keep  $f(n)$  linear or constant.

## Recurrence templates (cheat-sheet):

- $T(n) = 2T(n/2) + n \Rightarrow \Theta(n \log n)$
- $T(n) = T(n/3) + T(2n/3) + n \Rightarrow \Theta(n \log n)$
- $T(n) = aT(n/b) + n^k$

**Depth and space:** recursion depth  $\approx \log_b n$  (balanced) or larger if uneven; watch stack usage.

**Cut-offs:** for small  $n$  switch to a simple routine (Example: insertion sort) to reduce overhead.

**Memory model (JVM):** prefer in-place where possible; avoid per-level allocations; reuse buffers.

**Parallelism:** independent subproblems → parallel tasks; span  $\approx$  recursion depth.

**Robustness:** for skewed splits, recurse on the **smaller** part or iterate the larger.





# Recurrence Trees: Intuition & Practice

**Model.** Represent the recurrence as a rooted tree: the root is the original instance; children are subproblems produced by the divide step; leaves are base cases.

**Per-level accounting.** For each level, consider (i) how many subproblems appear and (ii) the work performed by each; assess the total work per level.

**Regimes of contribution.**

- *Top-dominated:* per-level work decreases with depth; upper levels determine the total.
- *Balanced:* per-level work remains approximately constant; total scales with the number of levels.
- *Bottom-dominated:* per-level work increases with depth; leaves determine the total.

**Procedure.**

1. Unroll several levels of the tree.
2. Record the growth of node counts and per-node work across levels.
3. Classify the regime (top-dominated / balanced / bottom-dominated).
4. Estimate the number of levels (e.g., logarithmic under balanced binary splits; linear under unit decreases).
5. Aggregate per-level contributions and include leaf costs when non-trivial.

**Practice notes.**

- For uneven splits, analyze branches separately and sum their per-level contributions.
- Account explicitly for the combine step at each node.
- Employ small-input cut-offs to reduce constant-factor overheads.



# Master Theorem

A classification rule to estimate running time of divide-and-conquer algorithms with **equal-size subproblems** and an extra **combine** step.

Each call splits into the same number of subproblems of the **same size** (e.g., halves); the combine cost is “smooth” (no wild oscillations). Floors/ceilings don’t change the asymptotics.

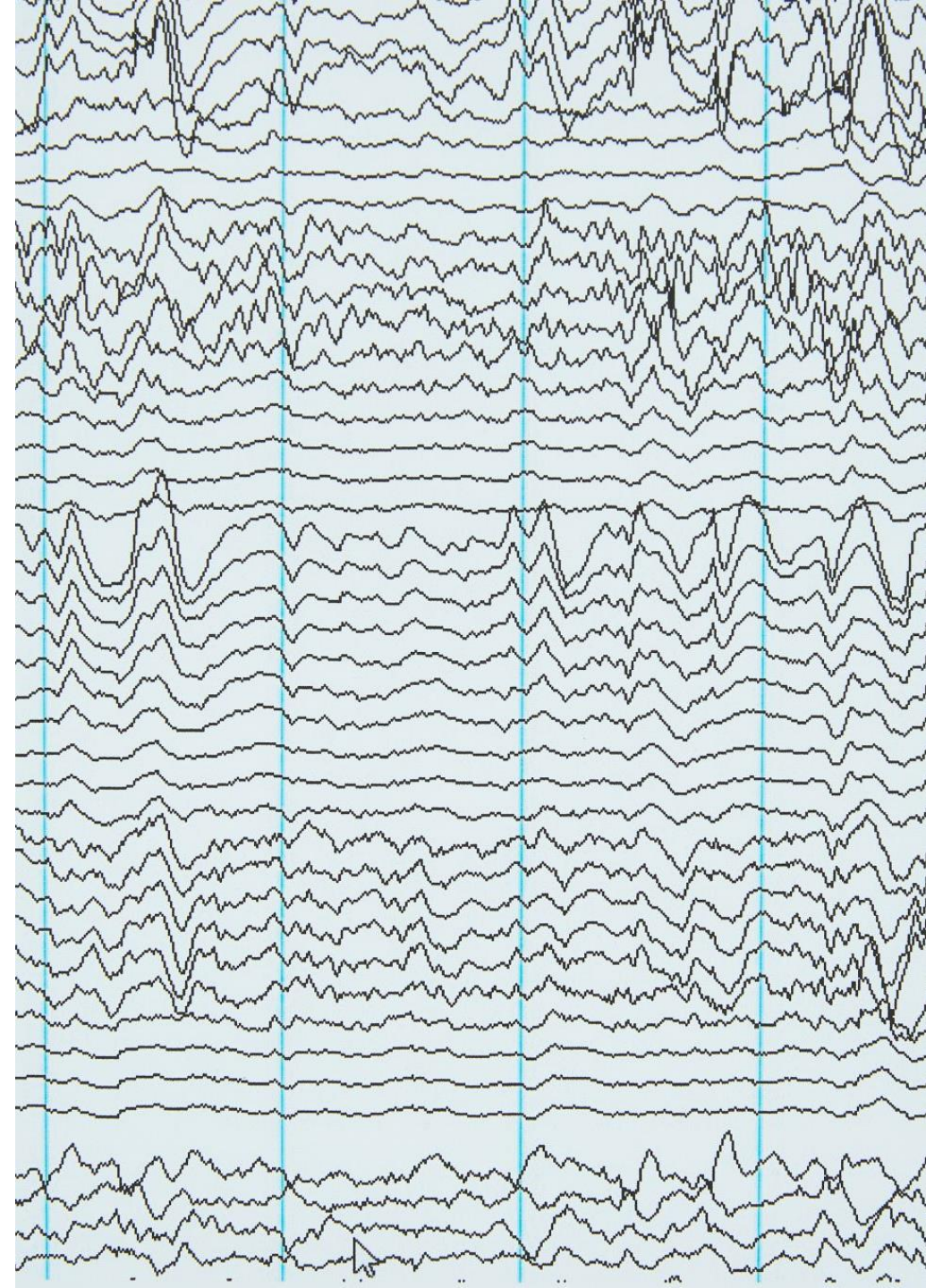
Compare the total work **done by all subproblems** at a level with the **combine work** at that level.

**Three outcomes.**

- 1. Recursive-dominated:** subproblem work is larger → total follows the recursive branching (e.g., four half-size subcalls with linear combine → **quadratic time**).
- 2. Balanced:** subproblem and combine work are on the same scale → same growth **with an extra logarithmic factor** (classic **merge sort** →  **$n \log n$** ).
- 3. Combine-dominated:** combine work is larger (and regularity holds) → total **matches the combine work** (e.g., two half-size subcalls with **quadratic** combine → **quadratic** overall).

**Examples**

- Merge sort: split into two equal halves; combine by linear merge →  **$n \log n$** .
- Two equal halves + quadratic combine → **quadratic** time.
- Four equal halves + linear combine → **quadratic** time (recursive part dominates).





# Beyond Master: Akra–Bazzi

A general tool to solve running-time recurrences for divide-and-conquer algorithms when subproblems are of **unequal sizes** and/or the combine cost is not a simple polynomial that fits the Master Theorem neatly.

Master Theorem assumes the same subproblem size in each branch (e.g.,  $n/2$  and  $n/2$ ). Many real recurrences are asymmetric (e.g.,  $n/3$  and  $2n/3$ ) or have additive shifts. Akra–Bazzi covers these cases.

It finds a critical exponent  $p$  that “balances” the recursion tree so that the total work per level is roughly flat. Then it compares the non-recursive work  $g(n)$  (the combine/overhead term) against  $n^p$  to decide what dominates the total cost.

- Uneven splits ( $T(n) = T(n/3) + T(2n/3) + \dots$ ).
- Multiple different fractions ( $T(n) = T(n/2) + T(n/3) + \dots$ ).
- Combine terms that are awkward for Master (e.g.,  $n / \log n$ ,  $n \log n$ , etc.).
- Small additive shifts in subproblem sizes (like  $T(\lfloor n/2 \rfloor)$  or  $T(n/2 + O(1))$ ).

1. Write the recurrence in the Akra–Bazzi form ( $\sum a_i \cdot T(b_i \cdot n + h_i(n)) + g(n)$ ).

2. Solve for  $p$  from the balance equation:  $\sum a_i \cdot b_i^p = 1$ .

3. Compare  $g(n)$  with  $n^p$ : smaller  $\rightarrow T(n) \approx n^p$ ; similar (up to logs)  $\rightarrow$  add a log factor; larger  $\rightarrow T(n) \approx g(n)$  (under a regularity condition).

4. State the final  $\Theta$ -bound.

- How it differs from Master:
- Handles **unequal** subproblem sizes.
- Allows small additive shifts  $h_i(n)$ .
- Uses a balancing exponent  $p$  instead of the single threshold  $n^{\log_b a}$  from Master.

Thank you

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