

function selectionSort(array):
 for i = 0 to size - 1
 minIndex = i
 for j = i + 1 to size
 if array[j] < array[minIndex]
 minIndex = j
 swap array[i] with array[minIndex]
BEST TC = n²
WORST TC = n²

procedure insertionSort(A : array of items)
 int holePosition
 int valueToInsert
 for i = 1 to length(A) inclusive do:
 valueToInsert = A[i]
 holePosition = i
 while holePosition > 0 and A[holePosition-1] > valueToInsert do:
 A[holePosition] = A[holePosition-1]
 holePosition = holePosition - 1
 end while
 A[holePosition] = valueToInsert
 end for
 end procedure

function MERGESORT(ARRAY, START, END)
 if END - START + 1 == 1 then
 return
 end if
 if END - START + 1 == 2 then
 if ARRAY[START] > ARRAY[END] then
 TEMP = ARRAY[START]
 ARRAY[START] = ARRAY[END]
 ARRAY[END] = TEMP
 end if
 return
 end if
 HALF = int((START + END) / 2)
 MERGESORT(ARRAY, START, HALF)
 MERGESORT(ARRAY, HALF + 1, END)
 MERGE(ARRAY, START, HALF, END)
 end function **TC = n log n**

function PARTITION(ARRAY, START, END)
 PIVOTVALUE = ARRAY[END]
 PIVOTINDEX = START
 loop INDEX from START to END
 if ARRAY[INDEX] <= PIVOTVALUE
 TEMP = ARRAY[INDEX]
 ARRAY[INDEX] = ARRAY[PIVOTINDEX]
 ARRAY[PIVOTINDEX] = TEMP
 PIVOTINDEX = PIVOTINDEX + 1
 end if
 end loop
 return PIVOTINDEX - 1

Base case: $T(1) = d$. $c \log n = c \cdot \log 1 = 0$ ✓
 $T(2) = 2T(1) + d = 2d + d = 2(1 \cdot d)$
 $c \cdot \log 2 = 2c$. True when $c \geq d$ ✓
 Inductive step: Assume $T(k) \leq c \cdot k \log k$ for all $k < n$.
 $T(n) = 2T(\frac{n}{2}) + d \leq 2 \cdot c \cdot \frac{n}{2} \log \frac{n}{2} + d$
 $\leq cn(\log n - 1) + d$
 $= cn \log n - cn + d$
 desired result

function QUICKSORT(ARRAY, START, END)
 if START >= END then
 return
 end if
 PIVOTINDEX = PARTITION(ARRAY, START, END)
 QUICKSORT(ARRAY, START, PIVOTINDEX - 1)
 QUICKSORT(ARRAY, PIVOTINDEX + 1, END)
 end function **BEST TC = n log n**
WORST TC = n²

1 to n, i = 2 to n steps $\cdot \theta(n)$
 1 to n, i = 3 to n steps $\cdot \theta(\log n)$
 1 to n, i = 1/3 to n steps $\theta(\log n)$

$A \cdot P \Rightarrow \sum_{i=1}^k i = 1 + 2 + 3 + 4 + \dots + k = \frac{k(k+1)}{2}$
 $H \cdot N \Rightarrow \sum_{i=1}^k \frac{1}{i} = \frac{1}{1} + \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{k} = \log k = \theta(\log k)$

$G \cdot P \Rightarrow \sum_{i=0}^k x^i = x^0 + x^1 + x^2 + \dots + x^k = \frac{x^{k+1} - 1}{x - 1}$
 $H \cdot P \Rightarrow$ when $k < 1$, eg $x = \frac{1}{2}$; $\sum_{i=0}^k \frac{1}{1-x}$

$T(n) = aT(\frac{n}{b}) + f(n)$ has the following asymptotic bound
 1) If $f(n) \in O(n^{\log_b a - \epsilon})$ for some $\epsilon > 0$, then $T(n) \in \theta(n^{\log_b a})$
 2) If $f(n) \in \theta(n^{\log_b a})$, then $T(n) \in \theta(n^{\log_b a} \cdot \log n)$
 3) If $f(n) \in \Omega(n^{\log_b a + \epsilon})$ for some $\epsilon > 0$ and if $a \cdot f(\frac{n}{b}) \leq c \cdot f(n)$ for $c < 1$, then $T(n) \in \theta(f(n))$

$P[E] = (1/6) \cdot 1 + (5/6) \cdot 0$
 $Ev[X=5] = (1/6) \cdot 5$

Ω -notation (omega): $f(n) \in \Omega(g(n)) \Leftrightarrow \exists c > 0, \exists n_0 > 0, \forall n \geq n_0, f(n) \geq c \cdot g(n)$
 Intuition: $f(n)$ is $\Omega(g(n))$ if the asymptotic growth of $f(n)$ is at most the asymptotic growth of $g(n)$
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 θ -notation (theta): $f(n) \in \theta(g(n))$ and $f(n) \in \Omega(g(n))$

a) $4n^5 - 50n^3 + 10n \in \theta(n^5)$
 First: $4n^5 - 50n^3 + 10n \in O(n^5)$
 $4n^5 - 50n^3 + 10n \leq 4n^5 + 10n \leq 4n^5 + 10n^5 \leq 14n^5$
 $\therefore f(n) \leq c \cdot g(n)$ for $c = 14$, for all $n \geq 1$
 Second: $4n^5 - 50n^3 + 10n \in \Omega(n^5)$
 $4n^5 - 50n^3 + 10n \geq 4n^5 - 50n^3 \geq n^5 + 3n^5 - 50n^3 \geq n^5$ when $n \geq 3$
 $\therefore f(n) \geq c \cdot g(n)$ for $c = 1$ and $n_0 = 3$
 Inductive steps: Initialization; iteration (before and after same); termination

function binary_search(list, target):
 left = 0
 right = length(list) - 1
 while left <= right:
 mid = (left + right) // 2
 if list[mid] == target:
 return mid
 elif list[mid] < target:
 left = mid + 1
 else:
 right = mid - 1
 return -1 **BEST CASE: 1, WC: log n**

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$P[E] = (1/6) \cdot 1 + (5/6) \cdot 0$
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 $\therefore f(n) \geq c \cdot g(n)$ for $c = 1$ and $n_0 = 3$
 Inductive steps: Initialization; iteration (before and after same); termination

1. Big oh Notation - Use the defⁿ of Big oh & Omega
 to show that $4n^2 - 8n + 6 \in \theta(n^2)$
 $0 = 4n^2 - 8n + 6 \leq 4n^2 + 6 \leq 4n^2 + 6n^2 = 10n^2$
 $f(n) \leq c \cdot g(n)$ for $c = 10 \quad \forall n \geq n_0 = 1$
 $-2 = 4n^2 - 8n + 6 \geq 4n^2 - 8n = n^2 + (3n^2 - 8n) \geq n^2$
 when $3n^2 - 8n \geq 0 \Rightarrow n \geq \frac{8}{3}$
 $f(n) \geq c \cdot g(n)$ for $c = 1 \quad \forall n \geq n_0 = 3$

2. Recursion Tree - Use recursion tree to generate a guess of the asymptotic complexity of a divide & conquer algorithm with the running time $T(n) = 4T(n/2) + O(n^3)$

 $\sum_{i=0}^{\log_2 n} \frac{n^3}{2^i} = n^3 \sum_{i=0}^{\log_2 n} (\frac{1}{2})^i < n^3 \sum_{i=0}^{\infty} (\frac{1}{2})^i < 2n^3$

3. Induction let $T(n) = 3T(n/3) + dn$ with $T(1) = a$ for constants d and a . Use induction to prove that $T(n) \in O(n \log n)$

Base case: $n = 3 \quad T(3) = 3T(1) + 3d \Rightarrow 3a + 3d \Rightarrow 3(ad)$
 Inductive step Assume $T(k) \leq c \cdot k \log k \quad \forall k < n$
 $T(n) = 3T(\frac{n}{3}) + dn \leq 3[\frac{c}{3} \log \frac{n}{3}] + dn$
 $= c n [\log_3 n - \log_3 3] + dn$
 $= c n \log_3 n - cn + dn$
 $\Rightarrow \leq c n \log_3 n$ (when $c \geq d$)
 $\Rightarrow T(n) \leq c \cdot n \log_3 n$ for $c = a + d \quad \forall n \geq 3$

4 Master Method solve the following recurrences using the master Method Justify your answers exactly (i.e., specifying ϵ and check the regularity condition if necessary).
 (i) $T(n) = 2T(n/2) + n^2$
 $a = 2, b = 2, f(n) = n^2, n^{\log_b a} = n^{\log_2 2} = n^1$
 $n^2 \in \Omega(n^1)$ for $\epsilon = 1$
 $a f(\frac{n}{b}) = 2(\frac{n}{2})^2 = \frac{n^2}{2} = cn$ for $c = \frac{1}{2}$. case 3 holds
 $T(n) \in \theta(n^2)$

(ii) $T(n) = 27T(n/3) + n^3$
 $a = 27, b = 3, f(n) = n^3, n^{\log_3 27} = n^3$
 case 2 holds
 $\Rightarrow T(n) \in \theta(n^3 \log n)$

(iii) $T(n) = 9T(n/3) + n \log n$
 $a = 9, b = 3, f(n) = n \log n, n^{\log_3 9} = n^2$
 $n \log n \in o(n^{2-\epsilon})$ for $\epsilon = \frac{1}{2}$ NOTE Any $\epsilon \in (0, 2)$ works
 $\epsilon = 1$ does not work
 $T(n) \in \theta(n^2)$

$T(n) = aT(n/b) + f(n)$ has the following Asymptotic bounds
 (i) If $f(n) \in O(n^{\log_b a - \epsilon})$ for some $\epsilon > 0$, then $T(n) \in \theta(n^{\log_b a})$
 (ii) If $f(n) \in \theta(n^{\log_b a})$, then $T(n) \in \theta(n^{\log_b a} \cdot \log n)$
 (iii) If $f(n) \in \Omega(n^{\log_b a + \epsilon})$ for some $\epsilon > 0$, and if $a \cdot f(\frac{n}{b}) \leq c \cdot f(n)$ for $c < 1$, then $T(n) \in \theta(f(n))$ (regularity condⁿ)

5. Randomized Analysis
 Suppose someone offers to let you play a game. They will randomly (and independently) roll three dice: a red die, a green die, and a blue die. If you choose to play, you will pay \$5 to enter the game, and you will try to guess the number that is the sum of the three dice from your game for each side, e.g., red = 3, green = 4, and blue = 1. If you guess exactly one of the three correctly, then they will give you \$1 back. If you guess exactly two of them correctly, they will give you \$5 back. If you guess all three correctly, they will give you \$100 back. What is the expected value of this game from your perspective?
 $X(s) = \{-4, 0, 95, -5\}$
 miss 2 miss 1 miss 0 miss 3
 $E(X) = P(X = -4) \cdot -4 + P(X = 0) \cdot 0 + P(X = 95) \cdot 95$
 $= 0 + P(X = 5) \cdot -5$

$P(X = 95) = \frac{1}{6} \times \frac{1}{6} \times \frac{1}{6} = (\frac{1}{6})^3$
 $P(X = -5) = \frac{5}{6} \times \frac{5}{6} \times \frac{5}{6} = (\frac{5}{6})^3$
 $P(X = -4) = \frac{1}{6} \times \frac{5}{6} \times \frac{5}{6} \times 3 = \frac{75}{6^3}$
 $E(x) = 95(\frac{1}{6})^3 + -5(\frac{5}{6})^3 + -4(\frac{75}{6^3})$
 don't need to simplify an eqn

5. Divide and Conquer
 Suppose we have a two-dimensional array of (positive or negative) integers A[2][2] such that each each row and column is monotonically increasing. That is, if you consider a row and scan from left to right, the numbers increase. Similarly, if you scan a column from bottom to top, the numbers increase. We are interested in finding the largest number in the array that is less than 0. Give a divide and conquer algorithm which runs in $O(n)$ time (i.e. strictly faster than linear time), where n is the total number of integers in A.

Idea: check # in middle. If < 0 , then answer cannot be in lower left quadrant (all numbers here are less than middle value)
 Similarly, if it is ≥ 0 then answer cannot be in upper right (all numbers here are greater than middle)

If middle < 0 , we call 3 subproblems
 If middle ≥ 0 , we call 3 subproblems

 Rec Search (A, rb, rt, cl, cr)
 if (rt-rb == 1 or cr-cl == 1) {
 binary search that column or row for 0 and then return the largest # < 0. If all are ≥ 0 , return -oo
 }
 midRow = $\frac{r+b}{2}$; midCol = $\frac{m}{2}$;
 middle = A[midRow][midCol];
 if (middle < 0) {
 upLeft = Rec Search (A, midRow+1, rt, cl, midCol);
 downRight = Rec Search (A, rb, midRow, midCol+1, cr);
 upRight = Rec Search (A, midRow, rt, midCol, cr);
 Return Max (upLeft, downRight, upRight);
 }
 else {
 upLeft = Rec Search (A, midRow, rt, cr, midCol-1);
 downRight = Rec Search (A, rb, midRow-1, midCol, cr);
 bottomLeft = Rec Search (A, rb, midRow, cr, midCol);
 Return Max (upLeft, downRight, bottomLeft);
 }
 }
 $T(n) = 3T(\frac{n}{3}) + O(1)$
 $\Rightarrow T(n) \in \theta(n \log n)$

$A \cdot P \Rightarrow \sum_{i=1}^k i = 1 + 2 + 3 + \dots + k = \frac{k(k+1)}{2}$
 $H \cdot P \Rightarrow \sum_{i=1}^k \frac{1}{i} = \frac{1}{1} + \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{k} = \log k$
 $G \cdot P \Rightarrow \sum_{i=0}^k x^i = x^0 + x^1 + x^2 + \dots + x^k = \frac{x^{k+1} - 1}{x - 1}$
 $\Rightarrow G \cdot P \Rightarrow$ when $k < 1$, eg $x = \frac{1}{2}$; $\sum_{i=0}^k \frac{1}{1-x}$

$\lim_{n \rightarrow \infty} \frac{f(n)}{g(n)}$ a) $0 \Rightarrow f(n) \in o(g(n))$ b) $c \neq 0 \Rightarrow f(n) \in \theta(g(n))$
 c) $\infty \Rightarrow g(n) \in o(f(n))$

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 (ii) If $f(n) \in \theta(n^{\log_b a})$, then $T(n) \in \theta(n^{\log_b a} \cdot \log n)$
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