

## Greedy - Road trip

Kingston  $\rightarrow$  NYC

one road, find min no. of times we need to refuel car

Assumptions:

$\rightarrow$  no gas bar stations so tank is depleted

$\rightarrow$  distance known station 1  $\rightarrow$  station 2

$\rightarrow$  We know how much gas left tank how much it can cover

Recursive algo:

1. Sort stations by order from Kingston

$\{s_0, s_1, s_2, \dots, s_n\}$

2. Road trip ( $s_i$ ): Leave station with full tank  
 $t = i + 1$

while  $t < n$  and  $s_{t+1}$  reachable:

$t = t + 1$  # don't stop at  $s_i$

if  $t = n$ :

stop # arrived

else:

fill up gas at  $s_t$   
Road trip ( $s_t$ )

Complexity:

1. Sort:  $O(n \log n)$

2.  $O(n)$

$\therefore O(n \log n)$

## Proof of correctness - by induction

Basis:  $n = 1 \rightarrow$  to NYC in 1 tank of gas

Ind: optimal soln when full tank and k stations ahead of us

$k \geq 1$

IP: Call tank and  $k+1$  stations ahead

Solution:  $A = \{a_1, a_2, \dots, a_k\}$

1. Exists at least one optimal sol<sup>n</sup> that starts from  $a_1$ ,

2. If  $\{a_2, a_3, \dots, a_k\}$  is optimal for reduced problem

3. Combine 1 & 2, we get sol<sup>n</sup> to original prob.

Greedy:

1. initialize/sort
2. Pick best local option dep. on criteria
3. Update state of problem (remove etc)
4. Repeat until no more choices

Recursive format:

function greedyRecursive(problem-state):

Base case: if problem state empty / base condition  
return result

Best local: choice = selectBestChoice(problem\_state)

update problem state: new-problem-state = problem-state - choice

recur on remstate: result = greedyRecursive(new-problem-state)

combine: return combine(choice, result)

$\star$  We need to find (earl  
Proof by induction ac. of stations

Basis:  $n = 1$ , to NYC in 1 tank of gas

IH: optimal sol<sup>n</sup> when full tank and  $k$  stations ahead of us  
 $k \geq 1$

IP: show roadtrip can find optimal with full tank if  
 $k+1$  stations ahead.

$$A = \{a_1, a_2, a_3, \dots, a_k\} \quad O = \{o_1, o_2, \dots, o_r\}$$

solution       $t = k+1$   
 stations

we know  $a_1 > o_1$  as  $a_1$  is the furthest possible station  
 $o_2$  is the next, can get there

$O^* = \{a_1, o_2, o_3, \dots, o_r\}$  and  $|O^*| = |O|$   
 so it is farther and same no.  $\Rightarrow$  (same no. of stations)  
 and no loss in optimality

so for  $\{a_2, a_3, \dots, a_k\}$  is optimal to reduced problem  
 where there are  $k$  stations ahead (IH)

$$|\{a_2, a_3, \dots, a_k\}| \leq |\{o_2, o_3, \dots, o_r\}|$$

less                  more

$\therefore |A| \leq |O^*|$  and  $A$  is optimal.

## Roadtrip to Iterative:

sort stations  
 roadtrip-iter(stations)  
 $i = 0$  (start w full tank)  
 while  $i < n$ :  
 $t = i + 1$

move  $n$  for as possible

while  $t \leq n$  and isReachable( $s_i, s_t$ ):  
 $t = t + 1$

adjust  $t$

$t = t - 1$

if  $t = n$ :  
 break  
 else:  
 $i = t$

arrived

stop, fill up, continue

## Activity Selection

Given a few activities w start and end times, how many max activities can we do (so they don't overlap).

### Pseudo:

sort by earliest to latest finish time  
 activity select(x):  
 select  $x_1$   
 current time =  $\infty$ , end  
 for  $i = 2$  to  $n$ :  
 if  $x_i$ . start  $\geq$  current time:  
 select  $x_i$   
 current time =  $x_i$ . finish time

$$O(\log n) + O(n) = O(\log n)$$

does not work by start time as we don't know if  $a_1$  ends before  $a_2$

Proof by induction:

Base case, ( $n=2$ ):

if there's only 1 activity then greedy picks it.  
it's the most optimal

IH: For  $n \leq k$  activities, earliest finish time first greedy algo produces optimal solution

IS: Now for  $n = n+1$  activities

$$a_1.\text{finish} \leq a_2.\text{finish} \dots \leq a_{n+1}.\text{finish}$$

$$A = \{a_1, a_2, \dots, a_n\} \text{ set chosen by greedy}$$

$O = \{o_1, o_2, \dots, o_r\}$  any optimal / any compatible set for  $n+1$  activities

We need to show  $|A| \geq |O|$  (its more)

1. Show optimal solution with  $a_1$ ,

$a_1.\text{finish} \leq o_1.\text{finish}$  as  $a_1$  is the earliest finisher  
also we know  $o_1$  and  $o_2$  do not overlap and from  $O$ ,  $o_2$  is after  $o_1$  so

$$a_1.\text{finish} \leq o_1.\text{finish} \leq o_2.\text{start}$$

Thus we know swapping  $o_1$  for  $a_1$  does not break feasibility,  
 $a_1$  is compatible with  $o_2, o_3, \dots, o_r$   
so  $O^* = \{a_1, o_2, o_3, \dots, o_r\}$  is feasible

2. Show  $A$  is optimal

$\rightarrow$  greedy problem works on reduced  $\{o_2, o_3, \dots, o_r\}$   
to be optimal (IH)

$\rightarrow$  in  $O^*$ , rest of  $\{o_2, \dots, o_r\}$  is solution to some  
reduced problem so  $|\{a_2, o_3, \dots, o_r\}| \geq |\{o_2, o_3, \dots, o_r\}|$

$\therefore$  So  $|A| \geq |O^*|$  thus  $A$  is optimal sol'n to  $k+1$  activities

## Coin change

Change with fewest coins

Pseudocode:

sort  $n$  coins in decreasing values  $v_1, v_2, \dots, v_k$

$\text{MinCoinChange}(m)$ :

$r = m$   $\rightarrow$  remaining we need change for

while  $r > 0$ :

  find max coin of value  $v_i < r$

  select coin of value  $v_i$

$r = r - v_i$

$O(\log n + m)$

$\rightarrow$  doesn't work if no 1 cent coin

$\rightarrow$  if we have {9, 4, 13, m-12}

it will take 9 111

should take 4+4

Proof by induction

e.g. coin values: {200, 100, 25, 10, 5, 1}

base case:

$1 \leq m \leq 5$       only  $m$  pennies

$m=5$       1 nickel

$5 < m \leq 10$       Nickel and  $m-5$  pennies

$m=10$       dime

$10 < m \leq 15$       dime and  $m-10$  pennies

$15 < m \leq 25$       dime, nickel and  $m-15$  pennies

$m=25$       quarter

:

200

14: MinCoinChange provides optimal solution when target value is  $k$  and  $k \geq 200$

19: Min coinchange provides optimal solution when target value  $\underline{k+1}$

$A = \{a_1, a_2, \dots, a_s\}$  optimal  
 $O = \{o_1, o_2, \dots, o_r\}$  any choice

We NTS  $|A| \leq |O|$

1. Show optimal solution with  $a_i$ ,  
suppose an  $O$  doesn't have \$2

$O$  can have at most    1 \$1 , or get replaced by \$2  
2 \$0.25 , or get replaced by \$1  
4 \$0.01 , or get replaced by \$0.05  
2 \$0.1 or \$0.05 + \$0.1  
199¢                          194¢  
∴  $m \neq 200$  ¢

Coinchange by American coin?

### Fractional knap sack

Container of capacity =  $c$

set  $X = \{x_1, x_2, \dots, x_n\}$

set of fractions  $\{p_1, p_2, \dots, p_n\}$  s.t.  $0 \leq p_i \leq 1$

$\sum_{i=1}^n p_i \cdot x_i \cdot \text{mass} \leq c$  and  $\sum_{i=1}^n p_i \cdot x_i \cdot \text{value}$  is max

How to work  $x_i$  in  $X$ ?

1. Sort objs  $\{x_1, x_2, x_3, \dots, x_n\}$  in  $x_i \cdot \text{value}$  order  
 $x_i \cdot \text{mass}$

$O(n \log n)$

Greedy-FKP(x) :

total mass = 0

while totalmass < c :

take as much of cost as possible  $O(\alpha)$   
update total-mass.

$$\therefore O(n \log n)$$

Example		$x_1 + x_2 + \frac{1}{10}x_3 = 15$			$15 - 13 = 2$	
<u><math>c = 15</math></u>		<u><math>x_1 + x_2 + \frac{1}{10}x_3 = 15</math></u>			<u><math>\frac{2}{20} = 10\%</math></u> <u>total value =</u>	
	$x_1$	$x_2$	$x_3$	$x_4$	$x_5$	$x_6$
<i>value</i>	(15)	(14)	30	100	2	100,000
<i>mass</i>	(6)	(7)	(20)	80	2	100,001
$\frac{\text{value}}{\text{mass}}$	2.5	2	1.5	1.25	1	0.99999

$\rightarrow$  *high*      *low*

Here we take  $x_1 \approx i\pi/6$

$x_2$  as 7  
and 10% of  $x_3$   
 $= 15$

Base case :  $\lambda = 0$ ,  $x_0$  offers no pick

14: Greedy chooses optimal solution with objects

1P: Greedy chooses 'optimal' solution with  $k+1$  obj.

Greedy FXP  $s_1, l^n = t = \{p_1, p_2, p_3, \dots, p_{k+1}\}$   
 $a_n y^0 = \{q_1, q_2, q_3, \dots, q_{k+1}\}$

1. Optimal solution with  $p$ ,
  2.  $A$  is optimal

## I. Contradiction

we don't have a sol<sup>n</sup> with p,

O's first fraction is not  $p_1 - q_1 < p_1$

$$\text{Total mass (A)} = \text{Total mass (B)} = c$$

Since  $q_i < p_i$ ,  $x_i$  has to be a  $x_j$  where  $q_j > p_j$

$$O^* = \{p_1, q_2, q_3, \dots, q'_i, \dots, q_{n+1}\} \quad \xrightarrow{\text{extra as there is}} \quad z_i > p_i$$

make sure total\\_mass( $O^*$ ) =  $C$  as  $p_i > q_i$   
 $(p_i - q_i)x_i.\text{mass} = (q'_i - q_i)x_i.\text{mass}$   $q'_i < q_i$

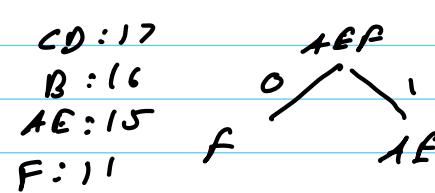
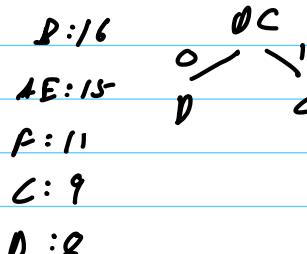
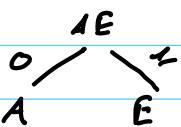
$$\begin{aligned} \text{total\_val}(O^*) - \text{total\_val}(O) &= (p_i - q_i)x_i.\text{value} - (q'_i - q_i)x_i.\text{value} \\ &= (p_i - q_i)x_i.\text{value} - \frac{(p_i - q_i)x_i.\text{mass}}{x_i.\text{mass}} \times x_i.\text{value} \end{aligned}$$

$$\begin{aligned} &= (p_i - q_i)x_i.\text{mass} \left( \frac{x_i.\text{value} - x_i.\text{val}}{x_i.\text{mass} - x_i.\text{mass}} \right) \\ &> 0 \end{aligned}$$

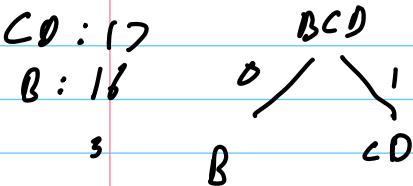
### Huffman coding

- > build binary tree from bottom up.
- > start with least freq letters and connect through shared parent nodes, 0 and 1
- > parent = single character joining two daughter
- > repeat until all added.

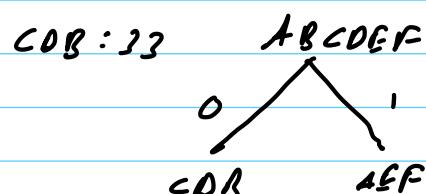
cg:  
B: 16  
F: 11  
C: 9  
D: 8  
E: 8  
A: 7

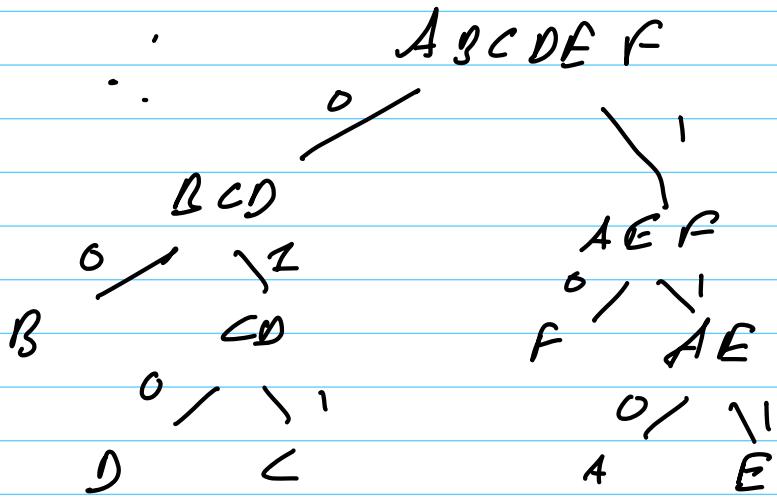


AEF: 26



AEF: 26





O (Log n)

Greedy:

sort

run to find local best

update problem statement

run on reduced problem

combine local best and reduced

Proof:

1. Base case

2. IH: Greedy finds optimal for k

3. IP: Greedy finds optimal for k+1

$$A = \{p_1, p_2, p_3, \dots, p_k\}$$

$$O = \{o_1, o_2, \dots, o_n\}$$

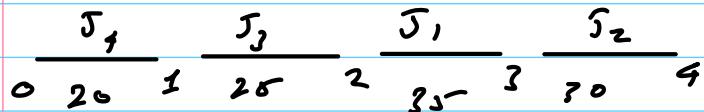
1. Show  $p_i$  is optimal

2. Show A is optimal (reduced)

3. Say combined is optimal

## Job sequencing problem

Job Sequencing with Deadlines						
n=7	J <sub>1</sub>	J <sub>2</sub>	J <sub>3</sub>	J <sub>4</sub>	J <sub>5</sub>	J <sub>6</sub>
Jobs	J <sub>1</sub>	J <sub>2</sub>	J <sub>3</sub>	J <sub>4</sub>	J <sub>5</sub>	J <sub>6</sub>
profits	35	30	25	20	15	12
deadlines	3	4	4	2	3	1
	*	*	*			



Pseudocode :

1. Sort depending on profit, in X as (profit, deadline)

n = max deadline number from X

Jobsequencing(X)

sequence = array with max size of deadline

for i in sequence :

if len(sequence) == n :

return sequence

else :

add i to sequence deadline position  
if it is filled then put in deadline-1  
position in sequence (loop till  
free position found )

Proof :

Base case : (n=0 or n=1)

if there's no job then will return

will return only job possible if it is

the only one that needs to be done

1H: Greedy algorithm provides optimal  
solution when there are k jobs  
where k ≥ 1

IP: We need to show that greedy algo finds the most optimal solution when there are  $k+1$  jobs

$$A = \{J_1, J_2, J_3, \dots, J_r\} \text{ by greedy}$$

$$O = \{O_1, O_2, O_3, \dots, O_k\} \text{ any optimal}$$

1. Show that  $J_1$  is optimal

Here we know that  $J_1$  is a tuple (profit, deadline) and is more optimal than  $O_1$ , the profit (line) for  $J_1$  is larger than for  $O_1$ , so we can replace  $O_1$  to make  $O^* = \{J_1, O_2, O_3, \dots, O_{k+1}\}$  such that  $J_1.\text{profit} > O_1.\text{profit}$ .

Here  $J_1$  is given the latest spot for its deadline but  $O_1$  may be given spot depending on if its deadline is different.

Since the  $J_1$  is now in  $O^*$ , it has a larger profit than  $O$ .

2. Show that  $A$  is optimal

The greedy algo carries out the algo on rest of  $O^* = \{O_2, O_3, \dots, O_k\}$  and we know by IH that it finds the most optimal from  $k$  jobs, thus

$O^{*\text{ ends}} \leftarrow$  — we get total profit  $A \geq \text{total profit } O$   
up to date

Thus we see by combining the first step ( $J_1$ ) and rest with IH we get the most optimal solution.

## Optimal merge pattern

$A B C D$   
 6 5 2 3  
 11 13 16  
 11 + 13 + 16 = 40  
 (Time)  
 (largest)

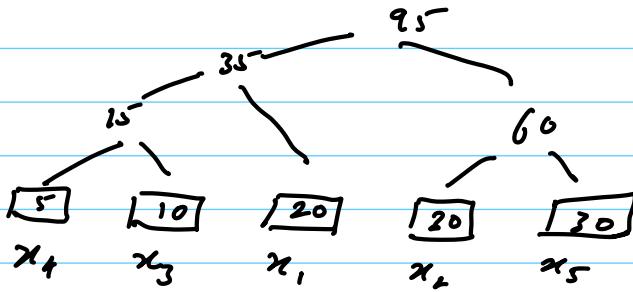
$A B C D$   
 6 5 2 3  
 11 13 16  
 11 + 5 + 16 = 32

$A B C D$   
 6 5 2 3  
 11 13 16  
 5 + 10 + 16 = 31 (smallest)

Greedy: always merge small lists, total merging time reduced

### example

Lists  $\rightarrow x_1, x_2, x_3, x_4, x_5$   
 sizes  $\rightarrow 20 \quad 30 \quad 10 \quad 5 \quad 30$



When we get 35, we have 20, 30, 10  
 We do  $30, 30 = 60$ , then we do  $35, 60 = 95$   
 $15 + 35 + 45 + 60 = 205$

(Used in Huffman)

## Practice problems week 6

a braids

arrival

departure

can arrive only when previous departed  
(similar to activity select)

*← Latency →* *Latency* *means* *time* *delay* *between* *two* *events*

K platforms, always enough to - a trains

$$X = \left[ \begin{matrix} (930, 1020) \\ (1000, 1340) \\ (1020, 1510) \\ (1350, 1600) \end{matrix} \right]$$

min-platforms (x)

sort dep on leg time

tuple = ?

current - finish - None

dictionary\_solutions = {}

for i in x:

$$\begin{cases} (830, 920) \\ (700, 840) \end{cases}$$

sort

use list platform available to  
assign platforms fit with available  
time

platform 0 to train 0 arrival time

for ; in x :

search for platform that's  
available is before start  
if not avail:

add new platform

see the dep time  
compare with last arrival time  
if it is after than assign id its  
station

otherwise go back and check arrival  
of the one before, if after assign  
it its station.

if we reach the fish and cone  
before, create a new station and  
assign  
return assignment

## Practice prob 7 Pseud.

Lamp posts

start at city hall (pos 0)

to Out & Earl (position n)

Total length = n

n+1 equally spaced lamp posts located at  $0, 1, 2, \dots, n$  on the street

i-th lamp post illuminates  $(i-r[i], i+r[i])$

min-lamp( $r$ )

$r = [0, 0, 1, 1, 0, 2]$

sort  $r = [0, 0, 0, 1, 1, 2]$

1 2 2 2 2 3

$\{(-2, 2), (-1, 3),$   
 $(1, 3), (2, 4),$   
 $(4, 5), (2, 8)\}$

$1 - 0,$   
 $3 - 1, 3 + 1$   
 $2, 4$   
 $5 - 2, 5 + 2$   
 $3, 7$

$\{(0, 0), (1, 1), (2, 2), (3, 4),$   
 $(3, 5), (3, 7)\}$

$r = \left( \begin{matrix} 1, 1, 2 \\ 0, 2, 2 \end{matrix} \right)$

$= \{(1, 2), (0, 2), (0, 4)\}$

$\{(-1, 1), (0, 2), (1, 3)\}$

min-lamp( $r$ ):

get new array with left and right cover of lamps

$arr = \{(\text{left}, \text{right}), (\text{left}, \text{right}), \dots\}$

sort arr by left endpoint, leftmost to rightmost

for  $i$  in arr:

if leftmost lamp leftend > 0:  
return None

general format :

1. sort(data)

2. count = 0

current\_state = start

3. for choice in data:

    if condition\_met(choice, current\_state):  
        update\_state(choice)  
        count += 1

return count or final\_state

$\left[ \left( \begin{matrix} (9:30, 12:00), (000, 11:00) \\ \text{arr dep} \end{matrix} \right) \right]$   
 $\left( \begin{matrix} (9:15, 12:20) \end{matrix} \right)$

let platform\_assignment(trains):  
 sort (train) by arr time  
 new list stations with arr time  
 add first train dep to station 0 in list  
 for i in rest of trains:  
 if "arrival time is after any stat avail time":  
 add train, station in list

else:  
 create new station,  
 assign

Proof by induction:

Base case ( $n=1/a=0$ ):

if there are no trains, there will not be any scheduling  
 if there is 1 train, it will be assigned one station, st = 0

IH: Greedy method finds the most optimal number of stations required when there are  $k$  trains.  
 $k > 1$

IP: We want to show greedy finds the most optimal no. of stations when no. of trains is  $(k+1)$

Assume  $A = \{s_1, s_2, s_3, \dots, s_t\}$  stations  
 found by greedy  
 Assume  $O = \{o_1, o_2, o_3, \dots, o_r\}$   
 found by any optimal

1. We show  $s_1$  is optimal: . . .  
 we take  $A$  and  $O$  so that  
 we know  $s_1$  has more trains than  $o_1$ ,

if one train arrives, the size of  $O$  will increase. However, if we use  $O^*$  with  $O^* = \{s_1, o_2, o_3, \dots, o_r\}$

$$(9-10) \quad 8-9 \quad (11)-12 \\ s_1 \quad s_2 \quad s_3 \\ n+k: \quad n+k: \quad n+k: \\ 10 \quad 9 \quad 12$$

$O^*$  will assign optimally s.t.  $|O^*| \leq |O|$

Step: Show  $A$  is optimal.

$$(9-10) \quad 8-9 \quad (11)-12 \\ s_1 \quad s_2 \quad - \\ n+k: \quad n+k: \\ 10 \quad 9$$

$k, 1H$

$O^*$  will same to  $A$

$$\therefore A \subseteq O //$$

$$\left[ \begin{smallmatrix} 1 & 1 & 2 \\ 0 & 1 & 2 \end{smallmatrix} \right] \quad \text{index } 1^* - \text{max index} = 2$$

$\{-1, 1, 0, 2, 4\}; f:$

$\{(0, 0), (1, 1), (1, 3), (2, 4), (4, 4), (3, 7)\}$

Damn

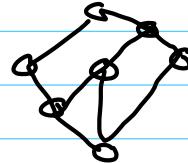
0, 1, 2, 3, 4, 7

5, 6

## MST (connected)

Prims:

connected tree  
connect by smallest



Kruskals:

does not make a cycle, always choose smallest edge  $\Theta(n \cdot e) \Theta(n^2)$

## Dijkstra Algo

shortest path by greedy  
each vertex given score from home vertex  
move to vertex with relatively less score. Move to new home vertex and give score to neighboring. (not connected given  $\infty$ )

T/F:

- |      |       |
|------|-------|
| 1. F | 8. T  |
| 2. T | 9. T  |
| 3. T | 10. F |
| 4. T |       |
| 5. F |       |
| 6. F |       |
| 7. T |       |

$d_3 \ d_1 \ d_2 \ d_4$   
 $P_3 \ P_2 \ P_1 \ P_1$

B 1

0 — 1 — 2 — 3 — 4

2. sort jobs according to profit descending  
let job-assignment( $X$ ):

create new list for slot assignment

set current as first in sorted list

for  $i$  in  $X$ :

if (current.  $d_i - 1$ , current.  $d_i$ ) not in list:

assign slot to  $i$

current = current.next

Chatter question

T/F

- |        |         |
|--------|---------|
| 1. F ✓ | 6. T —  |
| 2. T ✓ | 7. F ✓  |
| 3. T ✗ | 8. T —  |
| 4. T ✓ | 9. T ✓  |
| 5. T ✓ | 10. T ✗ |

B. Huffman Coding (symbols, freqs)

create priority queue with arc freq dep on freq

priority is the freq  $\propto \log v$

for  $i$  in  $i=1$  to  $n-1$ :  $O(n^2)$

left = symbol or first in Q

right = symbol or second in Q

joined = left + right

insert node joined into Q

leftover is the root.

Assign lefts and rights values of 0s and 1s by traversing

return set of (symbol, code) pairs,  
 $O(\log n)$

Task scheduling:

weight  $w_i$  and time  $t_i$

so we are give  $w_i$  and  $t_i$  for each  $i$

we find  $t_i/w_i$  for each  $i$

def scheduling ( $X$ ):

sort  $X$  by  $t_i/w_i$  in ascending order

current\_time = 0

for  $i$  sorted:

1. schedule  $i$  to run from  
current\_time

2. time [ $i$ ] = current\_time +  $p_i$

3. current\_time = current\_time +  $p_i$

return schedule