



Decision tree

Topics-

- Randomised Decision tree
- RDT complexity
- Distributional complexity
- Yao's Min Max Lemma



Randomised Decision tree


What?

A decision tree in which branch taken is determined by two factors:

1. Query value
2. Random choice(coin flip)

OR

We use some probability distribution over deterministic decision trees



Why?

Let us suppose T be a distribution out of which a tree t is chosen for computing f

$P(t)$ = Prob that tree t is chosen

For some input x ,

$$c(P,x) = \sum P(t).cost(P,x)$$

Where $c(P,x)$ = expected no of queries a tree chosen from T will make on input x



RDT complexity

- Randomised decision tree complexity $R(f)$ of f is defined as follows :

$$R(f) = \min(c(P,x))$$

Where x is worst case input

- Thus , $R(f)$ expresses how well best probability distribution of decision trees will do against worst possible input.



$R(f) \geq C(f)$ C : certificate complexity

Why?

- $R(f)$ is an expected value averaged over all values .
- $C(f)$ is the minimum value of complexity
- $R(f) \geq C(f)$ because average will never be less than the minimum value.

Example : Majority function

x1	x2	x3
0	0	0
0	0	1
0	1	0
0	1	1
1	0	0
1	0	1
1	1	0
1	1	1

$F = \text{Maj}(x1, x2, x3)$ i.e. Largest value

To check which is the largest number

We calculate that two need 2 queries with prob $\frac{1}{3}$
And 3 queries with prob $\frac{2}{3}$

Hence $R(f)$ by definition is $= 2 * \frac{1}{3} + 3 * \frac{2}{3} = \frac{8}{3}$



Distributional decision tree complexity

Distributional decision tree complexity is defined by

$$\Delta(f) = \min_D (\max_A d(A,D))$$

Where A - deterministic algorithm A runs over set of decision trees S that are deciders for f

- It measures the expected efficiency of most efficient decision tree algorithm works ,given the worst case distribution of inputs



Yao's Min Max Lemma

Why?


- Used in variety of settings to prove lowerbounds on randomised algorithms.

Let

X : a finite set of inputs

A : finite set of Algorithms to solve computational problem on these inputs

$\text{cost}(a,x)$: computational cost for algorithm a in A on x in X



Randomised Algorithm:

Lets assume a probability distribution R on A , then cost of R on input x , denoted by $\text{cost}(R,x)$ is $E[\text{cost}(A,x)]$.

Randomised complexity of the problem is

$$\min_R \max_x \text{cost}(R,x)$$

Let D be distribution on inputs. For algorithm A , the cost incurred at D ,

$$\max_D \min_A \text{cost}(A,D)$$

By Yao's Lemma ,the above two complexities are same.

- One defines a suitable distribution D on inputs
- One propose that 'Every deterministic algorithm incurs high cost say C on this distribution
- According to Yao's Lemma, randomised complexity then is atleast C .



Thank you



Questions

Assignment questions:


Proof of Yao's lemma.

Solution:

<http://ce.sharif.edu/courses/98-99/1/ce685-1/resources/root/Yao%20minmax.pdf>

Deep quiz questions : Find $R(f)$ for $\text{Maj}(x_1, x_2, x_3, x_4)$

Ans : $3 \cdot \frac{4}{24} + 4 \cdot \frac{20}{24} = \frac{92}{24} = \frac{23}{6}$



Light quiz question:

Where in the following cases can yao's lemma used?

- a) to establish a lower bound on the performance of randomized algorithms
- b) In two player zero sum game
- c) to find a distribution D for which any algorithm in A has high cost.
- d) All of the above



Resources

- <https://www.cs.purdue.edu/homes/egrigore/Fall12/lect20.pdf>
- Arora barak - Decision trees