

Question 2b: what if we ask you to return a **random largest number's index**

For example, given a **stream** like "1, 2, 5a, 3, 4, 3, 4, 5b", you may return 5a or 5b's index randomly.

			I					
	1	2	5a	3	4	3	4	5b
index	0	1	2	3	4	5	6	7
{2,7}								i

cur_max: 5

cur_max_count: 2

cur_max_sample_index: {2,7}

|

array[i] < cur_max -- continue

array[i] > cur_max -- cur_max = array[i], count = 1, cur_max_sample_index = i

array[i] == cur_max -- count++, do reservoir sampling in this case.

Question 3a: How to design a random number generator $\text{Random}(7)$, with **Random(5)**.

$\text{Random}(5)$ -- $\frac{1}{5}$ return 0, 1, 2, 3, 4

$\text{Random}(7)$ -- $\frac{1}{7}$ return 0, 1, 2, 3, 4, 5, 6 - uniformly distributed

Reversed direction (is easy):

$\text{Random}(7) \rightarrow \text{Random}(5)$

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0 1 2 3 4 5 6

$\frac{1}{7}$ $\frac{1}{7}$.. $\frac{1}{7}$..

```

int ret = Random(7);
while (ret >= 5) {
    ret = Random(7);
}
return ret;

```

do random(7) until the result is in the range of [0,1,2,3,4], return the result.

0,1,5,6,3,2,4,6,1,...

Probability **Normalization**

P(0 can be returned) = $1/7$	/	5/7	= $1/5$
P(1 can be returned) = $1/7$	/	5/7	= $1/5$
P(2 can be returned) = $1/7$	/	5/7	= $1/5$
P(3 can be returned) = $1/7$	/	5/7	= $1/5$
P(4 can be returned) = $1/7$	/	5/7	= $1/5$

How to Random(5) → Random(7)

How to use Random(5) to get a Random(x), $x > 7$.

step 1.

Random(25) - how to implement Random(25) using Random(5)

$5 * \text{Random}(5) + \text{Random}(5) = \text{Random}(25)$

random row random column

For each number generated with the method above, its probability
= $1/25$

index	0	1	2	3	4
0	0	1	2	3	4
1	5	6	7	8	9
2	10	11	12	13	14
3	15	16	17	18	19
4	20	21	22	23	24

I

$5 * \text{row} + \text{col}$

Or, you can think this way: 0 - 24 are all the 2 digits radix base 5 numbers: [0-4][0-4]

Random(5) for the first digit

Random(5) for the second digit

==> k digits base 5 numbers:[0-4][0-4]....[0-4]

Random(5) call k times, we can get **Random(5^k)**.

Question 4 : Given a **data flow**, how to keep track of the **median** of the numbers read so far? space: **O(n)**.

median - after sorting the sequence, the element at the middle position.

{1, 2, 3, **4**, 5, 6, 7} - median=4

{1, 2, 3, **4**, **5**, 6, 7, 8} - median = $(4+5)/2 = 4.5$

	5,	1,	2,	7,	4,	10,
median:	5,	3,	2,	3.5,	4,	4.5,

Follow up: Q4b

Delong (what if the number of element is too large)

small 50% elements

||

large 50% elements

Max_heap

Min_heap

xxxxxxxxxxxxxxxxxxxxxxxxX xxxxxX Yyyyyyy YYYYYYYYYYYYYYYYYYYYYYYYYYYY
60 99 190 200 180 200 300

1G memory

Follow up: Q4b

Delong (what if the number of element is too large)

small 50% elements

||

large 50% elements

Max_heap

Min_heap

xxxxxxxxxxxxxxxxxxxxxxxxX xxxxxX Yyyyyyyy YYYYYYYYYYYYYYYYYYYYYYYYYYYY
 59 60 99 100 170 180 200 300

1G memory

500M

250M + 250M buffer

[250m buffer] [60-99] [100-170] [250M buffer]

read 500M < 59 elements.

[500M < 59] [500M, 60-170]

X

large data → can not fit into memory → part of the data should be on the disk.

==> I/O , comparing to memory, very expensive. → best effort to retain the operations in memory.

|

==> single disk seek operation. ==> avoid such operation

==> batch process has better efficiency

1. once the memory is full, then we dump the buffer into the disk.

2. when the maximum value of the smaller half in memory < the maximum value on disk.