Approximate Frequency:

Findling frequent items deterministically

Stream:
$$\sigma = \langle a_1, ..., a_0, a_m \rangle$$
, $a_i \in \{1, ..., n_3\}$

Pungun of stream

9 length of stream

Majority

Frequent

Misra-Gnies Frequency Estimation A Process o Pouvide \hat{f}_i , $j \in \{1, ..., n\}$ A = empty (Baranced Brinary Search tree) Init: 2 approximate freer estimator Parocess Ctoken ?) CAJA A [1] if je keys (A) AGJ EAGJ+1 elle if | keys(A) | \le k-1 then A[7] < 1 erse (if ||Keys(A)|=k) for each le key (A) -> decrement step ALEJ CALLJ-I if ACRJ = 0, hemore it from A

top 10, m = 106, k = 100 les frequency items have poor unival 100 10 one survival comfor tables les frequency items have poor unvival 10 ore survival comfor tables

$$n=10^6$$
, 70 β item one soap, Pen , $mobile$, $laptop$, $pencil$ a_1, \ldots, a_m

Soap Bag =
$$\begin{cases} 2, 30, 31, 52 \end{cases}$$
 $\begin{cases} 3 \\ 4 \end{cases}$ A [3]

Pen = $\begin{cases} 2, 20, 25 \end{cases}$ $\begin{cases} 3, 30, 31, 52 \end{cases}$

Notice = $\begin{cases} 3, 18, 30, 31, 52 \end{cases}$ $\begin{cases} 3, 30, 31, 52 \end{cases}$ Pen = $\begin{cases} 3, 18, 30, 31, 52 \end{cases}$ $\begin{cases} 3, 30, 31, 52 \end{cases}$ Pen = $\begin{cases} 3, 30, 31, 52 \end{cases}$ $\begin{cases} 3, 30, 31, 52 \end{cases}$ Pen = $\begin{cases} 3, 30, 31, 52 \end{cases}$ $\begin{cases} 3, 30, 31, 52$

on the decrement sleep I think that the first items in the bag dusp ont

- * Items come into bag once, if they event they do not come back into the bag
 - & when decrement happene, k items leave at once, one from each hay.
 - \Rightarrow # decrements is at max $\frac{m}{b}$

$$f_j - \frac{m}{k} \leq f_j \leq f_j$$

Typical szeromie, m=16 , k=100 , top 10 one frequent sand aweries

$$f \sim \frac{m}{10} \sim 10^5$$
, $\frac{m}{k} = \frac{10^6}{100} = 10^4$
 $10^5 - 10^4 \leq \hat{f}_3 \leq 10^5$

 $f_g > \frac{m}{k} \Rightarrow f_g > 0$

But not the other way around => one can output in frequent

Say, k=2, m=5, S= {a,b,c3

a, a, a, a, b

$$f_1 = 4$$

$$f_2 = 1 \quad \Rightarrow \quad \text{item b} \quad \text{is occurring rune than } \frac{5}{2}$$

a, a, b, c, a

$$\hat{f}_{1} = 1, 2, 2, 1, 2$$