

Foundations of Computing II

CSE 312: Foundations of Computing II

## Skip Lists

TA's will run a review session in EEB 125 on Sunday from 4:30pm 6 pm.

- I will release a practice midterm later today or tomorrow.

We would like to find a simple data structure to implement the Set ADT. Some possible choices include:

| 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| ${ }_{13 \text { stion }}$ | ist[1] | 114t[2] | 114tt[3] | ${ }_{115 \mathrm{st} \text { [4] }}$ | ${ }_{\text {11st [5] }}$ | 118t[(6) |  |

We would like to find a simple data structure to implement the Set ADT. Some possible choices include:

list


We would like to find a simple data structure to implement the Set ADT. Some possible choices include:

list


We would like to find a simple data structure to implement the Set ADT. Some possible choices include:

| 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $1 \mathrm{list[0]}$ | $1 . \mathrm{st}[1]$ | $1 \mathrm{ist}[2]$ | $1 \mathrm{ist}[3]$ | $1 . \mathrm{st}[4]$ | $1 \mathrm{ist}[5]$ | $1 \mathrm{ist}[6]$ | $1 . \mathrm{st}[7]$ |

list


What if we combined these ideas? Could we get better behavior?

## Skip Lists: The Idea



## Skip Lists: Find



## Skip Lists: Insert



## Skip Lists: Insert



## Skip Lists: Insert



## Skip Lists: Insert



## Skip Lists: Insert



Definition (With High Probability)
We say an event, parametrized on $n, E_{n}$, happens with high probability when $\lim _{n \rightarrow \infty} \operatorname{Pr}\left(E_{n}\right)=1$.

Definition (Union Bound)
The probability that at least one of $\left\{A_{1}, \ldots, A_{n}\right\}$ happens is less than or equal to the sum of their probabilities. That is:

$$
\operatorname{Pr}\left(A_{1} \cup A_{2} \cup \cdots \cup A_{n}\right) \leq \operatorname{Pr}\left(A_{1}\right)+\operatorname{Pr}\left(A_{2}\right)+\cdots+\operatorname{Pr}\left(A_{n}\right)
$$

## Skip Lists: Analyzing Expected Height



## Skip Lists: Analyzing Expected Height



Let $E_{i}$ be the event that some element is on the $i$ th level. Note that this is the same as the Skip List having height $i$ or larger.

Let $x$ be a single entry of the Skip List, and $E_{x, i}$ be the event that $x$ is on the $i$ th level. Then, $\operatorname{Pr}\left(E_{x, i}\right)=\left(\frac{1}{2}\right)^{i}$.

## Skip Lists: Analyzing Expected Height



## Skip Lists: Analyzing Expected Height



By the union bound, the event that any entry reaches the $i$ th level is less than the sum of their probabilities. That is: $\operatorname{Pr}\left(E_{i}\right) \leq \frac{n}{2^{i}}$.

Let $c \geq 2$ be a natural number constant.
Now, consider $\operatorname{Pr}\left(E_{c \lg n}\right) \leq \frac{n}{2^{c \lg n}}=\frac{n}{\left(2^{\lg n}\right)^{c}}=\frac{n}{n^{c}}=\frac{1}{n^{c-1}}$.
Then, $\lim _{n \rightarrow \infty} \operatorname{Pr}\left(\overline{E_{c \lg n}}\right) \leq \lim _{n \rightarrow \infty} 1-\frac{1}{n^{c-1}}=1$

## Skip Lists: Analyzing Expected Space

Let $E_{i}$ be the event that some element is on the $i$ th level. Note that this is the same as the Skip List having height $i$ or larger.

Let $x$ be a single entry of the Skip List, and $E_{x, i}$ be the event that $x$ is on the $i$ th level. Then, $\operatorname{Pr}\left(E_{x, i}\right)=\left(\frac{1}{2}\right)^{i}$.

Let $E_{i}$ be the event that some element is on the $i$ th level. Note that this is the same as the Skip List having height $i$ or larger.

Let $x$ be a single entry of the Skip List, and $E_{x, i}$ be the event that $x$ is on the $i$ th level. Then, $\operatorname{Pr}\left(E_{x, i}\right)=\left(\frac{1}{2}\right)^{i}$.

Let $X$ be a r.v. for the number of nodes in the Skip List. Then, define $X_{i}$ as an r.v. for the number of nodes on level $i$. Finally, let $H$ be the height of the skip list.

Then, $X=\sum_{i=0}^{H} X_{i}$. So, $\mathbb{E}[X]=\sum_{i=0}^{H} \mathbb{E}\left[X_{i}\right]=\sum_{i=0}^{H} \sum_{x \in L} \operatorname{Pr}\left(E_{x, i}\right)<\sum_{i=0}^{\infty} \frac{n}{2^{i}}=2 n$.

## Skip Lists: Analyzing Expected Runtime of Find



## Skip Lists: Analyzing Expected Runtime of Find

list


Let $X$ be a r.v. for the number of node accesses in a single find operation. Then, $X=D+R$ where $D$ is the number of "down" movements and $R$ is the number of "right" movements. Furthermore, let $R_{i}$ be the number of "right" movements on level $i$. Note that

$$
\mathbb{E}[X]=\mathbb{E}[D]+\mathbb{E}[R]=\mathcal{O}(\lg n)+\sum \mathbb{E}\left[R_{i}\right]
$$

## Skip Lists: Analyzing Expected Runtime of Find



## Skip Lists: Analyzing Expected Runtime of Find



Consider a single row of the find operation. In particular, consider the keys that we visit on that row in reverse. We "go back left" until we hit a key that made it up to the $(i+1)$ st level. Since we're considering level $i$, we already know this key made it to level $i$; so, the probability that it makes it to level $i+1$ is just $1 / 2$. So, the expected number of keys we visit on level $i$ is just the number of times we flip a coin until we get a HEADS which means $\mathbb{E}\left[R_{i}\right]=2$. So, $\mathbb{E}[X]=\mathcal{O}(\lg n)$.

## Important Distributions

- Bernoulli $(p)$
- Binomial $(n, p)$
- Geometric $(p)$
- Uniform $(a, b)$
- Poisson $(\lambda)$


## Linearity

- Adding Expectations DOES NOT require independence.
- Adding Variances DOES require independence.

