

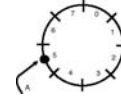
Choosing Hash Functions

- Mostly black magic...
division method: $h(k) = k \bmod m$
 - » Do not use $m = 2^p$ (will not use all the bits)
 - » choose $m = \text{prime}$ not too close to power of 2 or 10.
- Multiplication method: $h(k) = \lfloor m(kA - \lfloor kA \rfloor) \rfloor$
 - » choose $m \neq 2^p$, $0 < A < 1$, not too close to 0 or 1.
 - » If $m = 2^p$, then all we do is scramble by multiplication, and choose p bits to the left of binary point.
 - » Another explanation: consider going from $k-1$ to k .

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More multiplicative method

- Example: $m = 8$:
 - » each time k incremented:
 - go A around the circle.
 - Read off sector number.
 - » Note what happens if $A = .5$ or $1/2^p$.



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Universal Hashing

- Biggest problem with hash function:
There is always an adversarial sequence that "kills" it!
- Can not choose truly random function - m to the power of keys different functions. Too much storage !!!
- We need a small family H of hash functions, such that, for any input, only small percentage of these functions are "killed".
- Existence of such family? Size?
First, lets look at properties: What if $h()$ is truly random?
Then:

$$\Pr[h(x) = h(y)] = \sum_{i=1}^m \Pr[h(x) = h(y) = i] = m \cdot \frac{1}{m^2} = \frac{1}{m}$$

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Universal Hashing

- Assume we found a family H that satisfies the requirement that if $h \in H$ is chosen at random, then, for any $x \neq y$: $\Pr[h(x) = h(y)] = \sum_{i=1}^m \Pr[h(x) = h(y) = i] = m \cdot \frac{1}{m^2} = \frac{1}{m}$
(note that we are given $x \neq y$ and h chosen independently of $x \neq y$)

- Claim: this property is good enough for our purposes!

C_x = total # collisions with x (random variable!)

$\lambda_{xy} = \begin{cases} 1 & \text{if } h(y) = h(x) \\ 0 & \text{otherwise} \end{cases}$ indicator random variable

$$C_x = \sum_{y \neq x} \lambda_{xy}$$

By our assumption: $E[\lambda_{xy}] = 1/m$

This is enough for $1+\alpha$ expected performance

$$\Rightarrow E[C_x] = E\left[\sum_{y \neq x} \lambda_{xy}\right] = \frac{n-1}{m} \leq \alpha$$

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Construction Universal Hash Functions

- Need: for any $x \neq y$, proportion of functions in H that map both x and y to the same slot is $1/m$.
- Take m prime.
Input: $x = \langle x_0, x_1, \dots, x_r \rangle$, $\forall i, x_i < m$.
Let $a = \langle a_0, a_1, \dots, a_r \rangle$, $a_i \in [0, m-1]$ chosen uniformly at random.
- Define a function for each possible choice of a .
$$h_a(x) = \sum_{i=0}^r a_i x_i \bmod m$$
- Claim: the family H is universal.

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Proving Universality

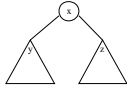
- Total number of functions in H : m^{r+1}
- Given particular x and y , what proportion of these functions map $h(x) = h(y)$? WLOG, assume $x_r \neq y_r$
- Choose a_0, a_1, a_2, \dots etc first. There are m^r choices. Now we need to choose a_r , to make $h(x) = h(y)$:
$$a_0(x_0 - y_0) = -\sum_{i=1}^r a_i(x_i - y_i) \bmod m$$

But $x_0 \neq y_0 \Rightarrow (x_0 - y_0) \text{ invertible mod } m$
 \Rightarrow There is only 1 solution.
- Thus, total number of functions such that $h(x) = h(y)$ is m^r , exactly the right proportion.

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Binary Search Trees (Chapter 13)

- In addition to insert/delete:
 - » Heaps supported min/max.
 - » Hashing supported search.
 - » What if we want both min/max/search, and also pred/succ ?
- Binary Search trees:

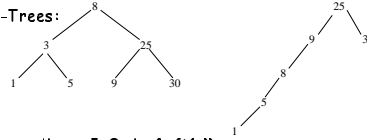


$\forall a \in \text{left tree}$	$key(a) \leq key(x)$
$\forall a \in \text{right tree}$	$key(a) \geq key(x)$

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Examples

- Legal B-Trees:



- In-Order walk: $\text{InOrder}(\text{left}(x))$
 $\text{print}(x)$
 $\text{InOrder}(\text{right}(x))$
- Note that given B-tree, can output sorted in $O(n)$ time !
 Gives lower bound on constructing B-Tree.
 (Compare with Heap !)

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