## Admin

Arora talk.
No class Monday.

## Review

Fingerprinting:

- Universe of size $u$
- Map to random fingerprint in universe of size $v \leq u$
- probability of collision $1 / v$

Freivald's technique

- verify matrix multiplication $A B=C$
- check $A B r=C r$ for random $r$ in $\{0,1\}^{n}$
- probability of success $1 / 2$
- works to check any matrix identity, not just product
- useful if matrices "implicit" like $A B$
- mapping size- $n^{2}$ matrices to size- $n$ vectors

In general, many ways to fingerprint explicitly represented objects. But for implicit objects, different methods have different strengths and weaknesses.
We'll fingerprint 3 ways:

- vector multiply
- number mod a random prime
- polynomial evaluation at a random point


## String matching

Checksums:

- Alice and Bob have bit strings of length $n$
- Think of $n$ bit integers $a, b$
- take a prime number $p$, compare $a \bmod p$ and $b \bmod p$ with $\log p$ bits.
- trouble if $a=b(\bmod p)$. How avoid? How likely?
$-c=a-b$ is $n$-bit integer.
- so at most $n$ prime factors.
- How many prime factors less than $k ? \Theta(k / \ln k)$
- so take $2 n^{2} \log n$ limit
- number of primes about $n^{2}$
- So on random one, $1 / n$ error prob.
- $O(\log n)$ bits to send.
- implement by add/sub, no mul or div!

How find prime?

- Well, a randomly chosen number is prime with prob. $1 / \ln n$,
- so just try a few.
- How know its prime? Simple randomized test (later)

Pattern matching in strings

- m-bit pattern
- $n$-bit string
- work mod prime $p$ of size at most $t$
- prob. error at particular point most $m /(t / \log t)$ from above
- so pick big $t$, union bound
- implement by add/sub as shift in bits


## Fingerprints by Polynomials

Good for fingerprinting "composable" data objects.

- check if $P(x) Q(x)=R(x)$
- $P$ and $Q$ of degree $n$ (means $R$ of degree at most $2 n$ )
- mult in $O(n \log n)$ using FFT
- evaluation at fixed point in $O(n)$ time
- Random test:
$-S \subseteq F$
- pick random $r \in S$
- evaluate $P(r) Q(r)-R(r)$
- suppose this poly not 0
- then degree $2 n$, so at most $2 n$ roots
- thus, prob (discover nonroot) $|S| / 2 n$
- so, eg, sufficient to pick random int in $[0,4 n]$
- Note: no prime needed (but needed for $Z_{p}$ sometimes)
- Again, major benefit if polynomial implicitly specified.

String checksum:

- treat as degree $n$ polynomial
- eval a random $O(\log n)$ bit input,
- prob. get 0 small

Multivariate:

- $n$ variables
- degree of term: sum of vars degrees
- total degree $d$ : max degree of term.
- Schwartz-Zippel: fix $S \subseteq F$ and let each $r_{i}$ random in $S$

$$
\operatorname{Pr}\left[Q\left(r_{i}\right)=0 \mid Q \neq 0\right] \leq d /|S|
$$

Note: no dependence on number of vars!
Proof:

- induction. Base done.
- $Q \neq 0$. So pick some (say) $x_{1}$ that affects $Q$
- write $Q=\sum_{i \leq k} x_{1}^{i} Q_{i}\left(x_{2}, \ldots, x_{n}\right)$ with $Q_{k}() \neq 0$ by choice of $k$
- $Q_{k}$ has total degree at most $d-k$
- By induction, prob $Q_{k}$ evals to 0 is at most $(d-k) /|S|$
- suppose it didn't. Then $q(x)=\sum x_{1}^{i} Q\left(r_{2}, \ldots, r_{n}\right)$ is a nonzero univariate poly.
- by base, prob. eval to 0 is $k /|S|$
- add: get $d /|S|$
- why can we add?

$$
\begin{aligned}
\operatorname{Pr}\left[E_{1}\right] & =\operatorname{Pr}\left[E_{1} \cap \overline{E_{2}}\right]+\operatorname{Pr}\left[E_{1} \cap E_{2}\right] \\
& \leq \operatorname{Pr}\left[E_{1} \mid \overline{E_{2}}\right]+\operatorname{Pr}\left[E_{2}\right]
\end{aligned}
$$

Small problem:

- degree $n$ poly can generate huge values from small inputs.
- Solution 1:
- If poly is over $Z_{p}$, can do all math $\bmod p$
- Need $p$ exceeding coefficients, degree
- $p$ need not be random
- Solution 2:
- Work in $Z$, deduce nonzero value from schwartz-zippel
- deduce nonzero mod random $q$ (as in string matching)
- so do all computation mod random $q$
- $q$ range must exceed bits (not value) of coeff.


## Perfect matching

- Define
- Edmonds matrix: variable $x_{i j}$ if edge $\left(u_{i}, v_{j}\right)$
- determinant nonzero if PM
- poly nonzero symbolically.
- so apply Schwartz-Zippel
- Degree is $n$
- So number $r \in\left(1, \ldots, n^{2}\right)$ yields 0 with prob. $1 / n$

Det may be huge!

- We picked random input $r$, knew evaled to nonzero but maybe huge number
- How big? About $n!r^{n}$,
- So only $O(n \log n+n \log r)$ prime divisors
- (or, a string of that many bits)
- So compute $\bmod p$, where $p$ is $O\left((n \log n+n \log r)^{2}\right)$
- only need $O(\log n+\log \log r)$ bits


## Treaps

Dictionaries for ordered sets

- New Operations.
- enumerate in order
- successor-of, predecessor-of (even if not in set)
- join $(S, k, T)$, split, $\operatorname{paste}(S, T)$

Binary tree.

- child and parent pointers
- endogenous: leaf nodes empty.
- balanced if depth $O(\log n)$
- average case.
- worst case

Tree balancing

- rotations
- implementing operations.
- red/black, AVL
- splay trees.
- drawbacks in geometry:
- auxiliary structure on nodes in subtree
- rebuild on rotation

Returning to average case:

- Assign random "arrival orders" to keys
- Build tree as if arrived in that order
- Average case applies
- No rotations on searches

Choosing priorities

- define arrival by random priorities
- assume continuous distribution, fix.
- eg, use $2 \log n$ bits, w.h.p. no collisions

Treaps.

- tree has keys in heap order of priorities
- unique tree given priorities-follows from insertion order
- implement insert/delete etc.
- rotations to maintain heap property

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Depth $d(x)$ analysis

- Tree is trace of a quicksort
- We proved $O(\log n)$ w.h.p.
- for $x \operatorname{rank} k, E[d(x)]=H_{k}+H_{n-k+1}-1$
- $S^{-}=\{y \in S \mid y \leq x\}$
- $Q_{x}=$ ancestors of $x$
- Show $E\left[Q_{x}^{-}\right]=H_{k}$.
- to show: $y \in Q_{x}^{-}$iff inserted before all $z, y<z \leq x$.
- deduce: item $j$ away has prob $1 / j$. Add.
- Suppose $y \in Q_{x}^{-}$.
- The inserted before $x$
- Suppose some $z$ between inserted before $y$
- Then $y$ in left subtree of $z, x$ in right, so not ancestor
- Thus, $y$ before every $z$
- Suppose $y$ first
- then $x$ follows $y$ on all comparisons (no $z$ splits
- So ends up in subtree of $y$

Rotation analysis

- Insert/Delete time
- define spines
- equal left spine of right sub plus right spine of left sub
- proof: when rotate up, on spine increments, other stays fixed.
- $R_{x}$ length of right spine of left subtree
- $E\left[R_{x}\right]=1-1 / k$ if rank $k$
- To show: $y \in R_{x}$ iff
- inserted after $x$
- all $z, y<z<x$, arrive after $y$.
- if $z$ before $y$, then $y$ goes left, so not on spine
- deduce: if $r$ elts between, $r$ ! of $(r+2)$ ! permutations work.
- So probability $1 / r^{2}$.
- Expectation $\sum 1 /(1 \cdot 2)+1 /(2 \cdot 3)+\cdots=1-1 / k$
- subtle: do analysis only on elements inserted in real-time before $x$, but now assume they arrive in random order in virtual priorities.

