# Algorithmen / Algorithms II 

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## Exercise:

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Web:
http://algo2.iti.kit.edu/AlgorithmenII_WS20.php

## 6 Randomised Algorithms

Using random (bits) to accelerate/simplify algorithms
Las Vegas: Guarantee a correct result - running time is a random variable already known:
$\square$ quicksort
$\square$ hashing
Monte Carlo: The result is incorrect with a failure probability $p$
Repeating the algorithm $k$ times decreases the failure-probability exponentially $\left(p^{k}\right)$.

Further details in "Randomised Algorithms" by Thomas Worsch

### 6.1 Sorting - (Result-)Checking

Permutation-Property (sortedness: is trivial)
$\left\langle e_{1}, \ldots, e_{n}\right\rangle$ is a permutation of $\left\langle e_{1}^{\prime}, \ldots, e_{n}^{\prime}\right\rangle$ exactly when

$$
q(z):=\prod_{i=1}^{n}\left(z-\operatorname{field}\left(\operatorname{key}\left(e_{i}\right)\right)\right)-\prod_{i=1}^{n}\left(z-\operatorname{field}\left(\operatorname{key}\left(e_{i}^{\prime}\right)\right)\right)=0
$$

Let $\mathbb{F}$ be a field, and map : Key $\rightarrow \mathbb{F}$ is injective.
Observation: $q$ has at most $n$ zeros (roots).
Evaluating $q$ at random position $x \in \mathbb{F}$.

$$
\mathbb{P}[q \neq 0 \wedge q(x)=0] \leq \frac{n}{|\mathbb{F}|}
$$

Linear time Monte Carlo algorithm
Question: Which field $\mathbb{F}$ do we use?

## Sort Checking II - with Lorenz Hübschle-Schneider

Is the finite sequence $E$ a permutation of another sequence $E^{\prime}$ ?
Let $h$ be a random hash function with destination range $0 . . U-1$,
$h(S):=\sum_{e \in S} h(e)$
Checker: return $h(E)=h\left(E^{\prime}\right)$

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$h(S):=\sum_{e \in S} h(e)$
Checker: return $h(E)=h\left(E^{\prime}\right)$
Correct if $E=E^{\prime}$.
Case $E \neq E^{\prime}$ : We show $\mathbb{P}\left[h(E)=h\left(E^{\prime}\right)\right] \leq \frac{1}{U}$
Let $e$ be an element, that appears $k \times$ in $E$ and $k^{\prime} \neq k \times$ in $E^{\prime}$.

$$
\begin{aligned}
h(E)=h\left(E^{\prime}\right) & \Leftrightarrow h(E \backslash e)+k h(e)=h\left(E^{\prime} \backslash e\right)+k^{\prime} h(e) \\
& \Leftrightarrow h(e)=\frac{h\left(E^{\prime} \backslash e\right)-h(E \backslash e)}{k-k^{\prime}}=: x
\end{aligned}
$$

$\mathbb{P}[h(e)=x] \leq \frac{1}{U}$ because $x$ is independent of $h(e)$

### 6.2 Hashing II

## Perfect Hashing

Idea: given a set of inputs $S$ make $h$ injective on this set.
This needs $\Omega(n)$ bits of space !

## Here: Fast Space Efficient Hashing

Represent a set of $n$ elements (with associated information) using space $(1+\varepsilon) n$.
Support operations insert, delete, lookup, (doall) efficiently.
Assume a truly random hash function $h$
([Dietzfelbinger, Weidling 2005] shows that this is justified.)


## Related Work

Linear probing: $E\left[T_{\text {find }}\right] \approx \frac{1}{2 \varepsilon^{2}}$
Uniform hashing: $E\left[T_{\text {find }}\right] \approx \frac{1}{\varepsilon}$
Dynamic Perfect Hashing,
[Dietzfelbinger et al. 94]
Worst case constant time for lookup but $\varepsilon$ is not small.


## Approaching the Information Theoretic Lower Bound:

## [Brodnik Munro 99,Raman Rao 02]

Space $(1+o(1)) \times$ lower bound without associated information [Botelho Pagh Ziviani 2007] static case.

Simple, fast, $\approx$ 3bits/element [FiRe/FiPHa:Müller,S,Schulze,Zhou 14]

## Cuckoo Hashing

[Pagh Rodler 01]
Table of size $(2+\varepsilon) n$.
Two choices for each element.
Insert moves elements;
rebuild if necessary.
Very fast lookup and delete.
Expected constant insertion time.


## Cuckoo Hashing - Rebuilds

When needed?
Graph model.
Node: table cells
Undirected edge: element $x \rightsquigarrow$ edge $\left\{h_{1}(x), h_{2}(x)\right\}$

Directed: $\left(h_{2}(x), h_{1}(x)\right)$ means element $x$ is stored at cell $h_{2}(x)$

Lemma: insert $(x)$ succeeds iff the component containing $h_{1}(x), h_{2}(x)$ contains no more edges than nodes.


## Cuckoo Hashing - Rebuilds

Lemma: insert $(x)$ succeeds iff
the component containing $h_{1}(x), h_{2}(x)$
contains no more edges than nodes.

## Proof outline: (if-part)

$h_{1}(x)$ in tree: flip path to root
$h_{1}(x)$ in pseudotree $p, h_{2}(x)$ in tree $t$ :
flip cycle and path to root in $t$


## Cuckoo Hashing - How Many Rebuilds?

Theorem: For truly random hash functions,
$\boldsymbol{P r}[$ rebuild necessary $]=\mathrm{O}(1 / n)$
Proof: via random graph theory

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## Random Graph Theory

[Erdős, Rényi 1959]
$\mathscr{G}(n, m):=$ sample space of all graphs with $n$ nodes, $m$ edges.
A random graph from $\mathscr{G}(n, m)$ has certain properties with high probability, here $\geq 1-\mathrm{O}(1 / n)$.

Famous: The evolution of component sizes with increasing $m$ :
$<(1-\varepsilon) n / 2$ : Trees and pseudotrees of size $\mathrm{O}(\log n)$
$>(1+\varepsilon) n / 2$ : A "giant" component of size $\Theta(n)$ (sudden emergence)
$>(1+\varepsilon) n \ln n / 2$ : One single component

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## Space Efficient Cuckoo Hashing

$d$-ary: [Fotakis, Pagh, Sanders, Spirakis 2003] $d$ possible places.
Insertion: BFS, random walk, ...


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## Space Efficient Cuckoo Hashing

$d$-ary: [Fotakis, Pagh, Sanders, Spirakis 2003] $d$ possible places.
blocked: [Dietzfelbinger, Weidling 2005] cells house $d$ elements.
Cache efficient !
blocked, $d$-ary, dynamic growing:
[Maier, Sanders 2017]

## Recap - Randomised Algorithms

$\square$ Easy, efficient algorithms
$\square$ In many cases the best known procedures
$\square$ Sometimes deterministic solutions are (provably) impossible
$\square$ Often examples for non-trivial analysis
$\square$ Sometimes esoteric theory leads to tools that are relevant in practice, e.g. random graph evolution
$\square$ Las Vegas versus Monte Carlo
$\square$ Bridge to algebra, e.g. Sort-Checker

## Lookout - Randomised Algorithms

External minimum spanning trees$\square$ More quicksort (strings, parallel)
$\square$ Smallest enclosing circle
$\square$ Online paging

