

# De Dictionariis Dynamicis Pauco Spatio Utentibus

(*lat.* On Dynamic Dictionaries Using Little Space)

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LATIN, March 2006

# Dictionaries

Maintain  $S \subset [u]$ ,  $|S| \leq n$  under:

$\text{INSERT}(x) : S \leftarrow S \cup \{x\}$

$\text{DELETE}(x) : S \leftarrow S \setminus \{x\}$

$\text{MEMBER}(x) : \text{is } x \in S?$

*OPUS CLASSICUM : [FKS'82]*

query:  $O(1)$  worst-case

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How to get w.h.p. from expected bounds?

independence

Idea:  $\sqrt{n}$  independent tables

- ➊ permute universe randomly:  $\pi$
- ➋ distribute elements by  $hi(\pi(x))$
- ➌ store  $lo(\pi(x))$  in hash table

Randomized Insertion

To be information-efficient, need to store just  $lo(\pi(x))$ .

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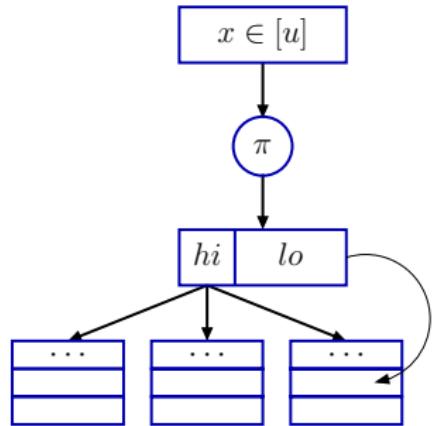
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Permuted universe

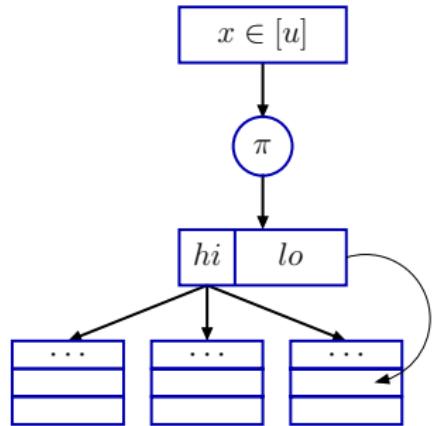
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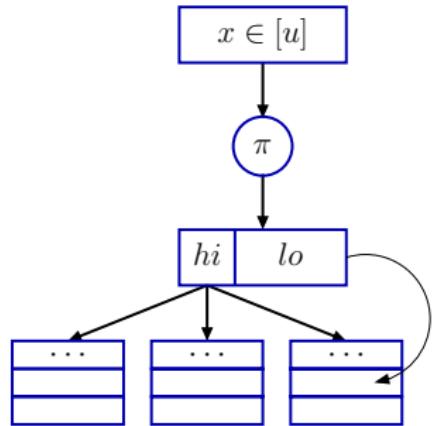
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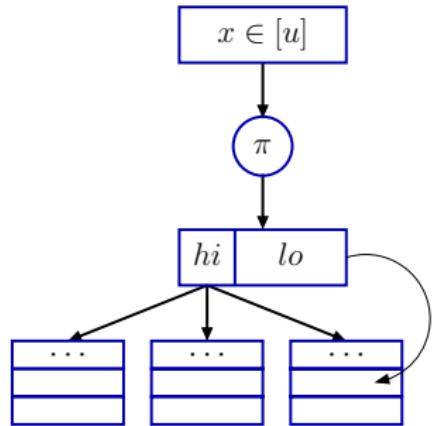
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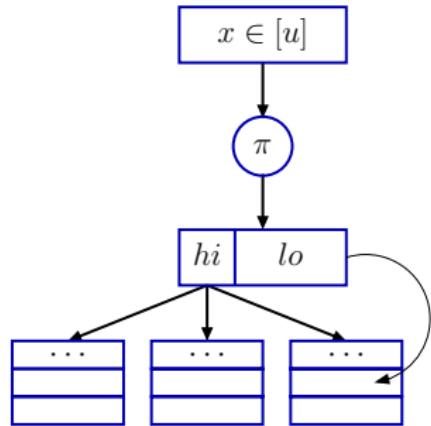
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# Highly Independent Permutations?

We need  $k$ -independent permutations.

Wait in line...

Idea: construct permutations with good  $k^{\text{th}}$  moment bounds.

Tools:

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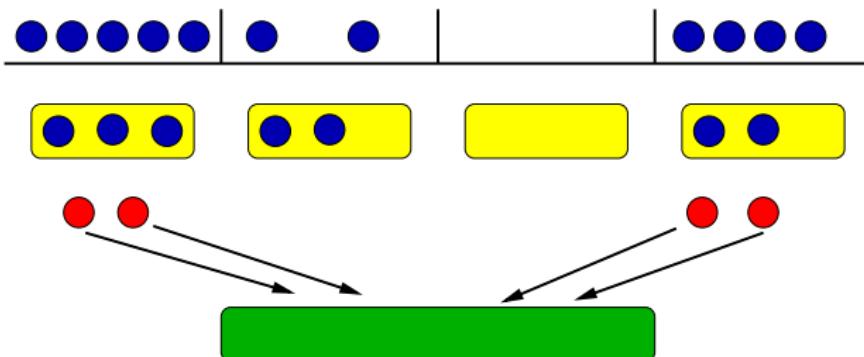
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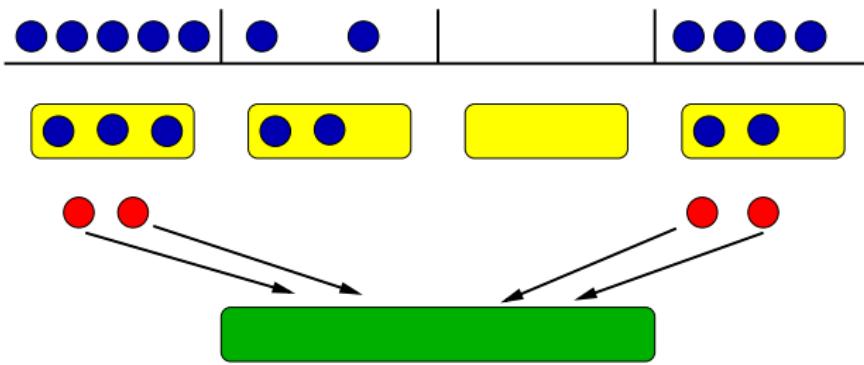
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- ➊ break universe into  $n/\lg n$  segments
- ➋ minidictionary in each segment with capacity  $2\lg n$
- ➌ fall back to high performance dictionary:



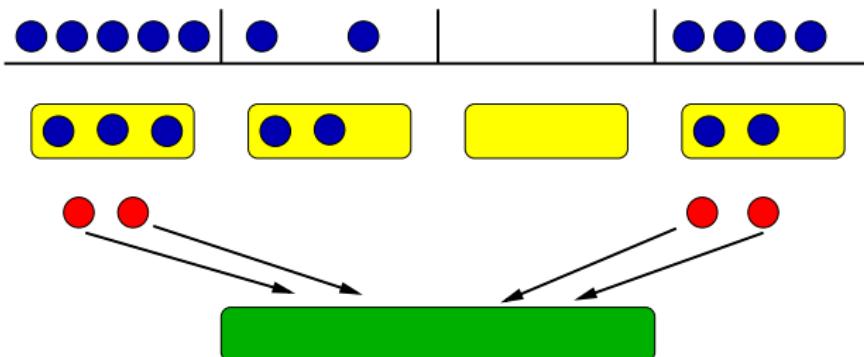
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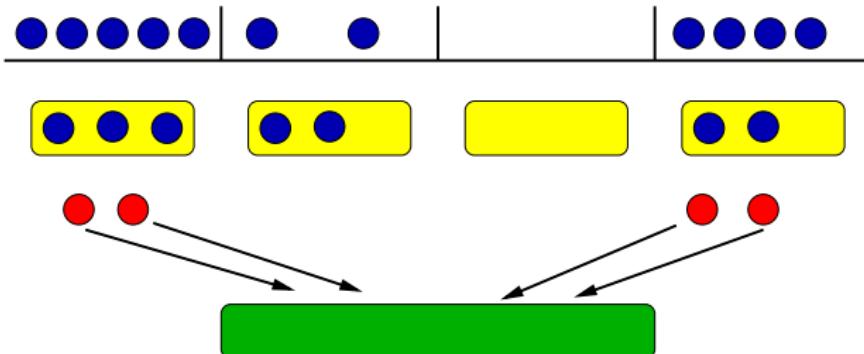
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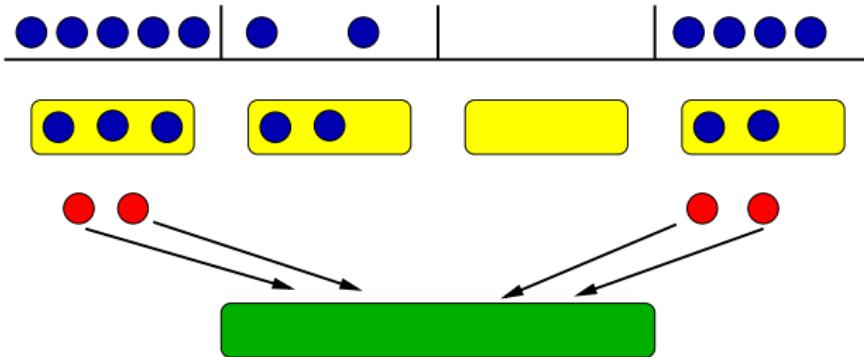
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  - elements overflowing capacity of minidictionary
  - elements for which the minidictionary failed



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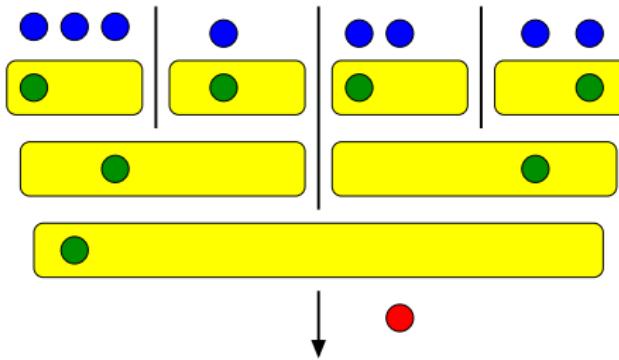
exp.  $O(1)$  bad elements from each segment  
 $\Rightarrow O(n/\lg n)$  total w.h.p.



Minidictionary stores  $O(\lg n)$  elements in **arbitrary order**  
 $\Rightarrow \Omega(\lg \lg n)$  bits per element!

For small universes, need to do something crazy...

$O(\lg \lg n)$  levels of filters  
on disjoint segments of the universe } all packed in a word!



# Dictionary? What dictionary?

What is the query?

membership: is  $x \in S$ ?

requires  $\geq \lg \binom{U}{n} = \Omega(n \lg \frac{U}{n})$  bits

retrieval: return  $\text{data}(x)$  if  $x \in S$



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- ① independence through permutation hashing
- ② multilevel word-packed dictionaries
- ③ dictionaries without membership

*FINIS*

*GRATIAS AGO VOBIS*