## Fast and Simple Compact Hashing via Bucketing

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## dynamic associative map

- K, V: sets
- $f$ maps a dynamic subset of size $n$ of K to V
- common representations of $f$
- search tree
- hash table


## setting

- $K=[1 . .|2 \omega|]$
- V = [1..|V|]
- in case that $\omega \leq 20$
- use plain array to represent $f \quad \mathrm{MiB}=1024^{2}$
- space: $\lg |V| / 8$ MiB
- for larger $\omega$ not feasible

> example:

- $|K|=2^{32}$
- $|\mathrm{V}|=2^{32}$


## memory benchmark

- setting :
- 32 bit keys
- 32 bit values
- randomly generated
- std: C++ STL hash table「unordered_map」
- closed addressing
- $n=216=65536$ : more than 2 GiB RAM needed!

$\begin{array}{lllllll}11 & 12 & 13 & 14 & 15 & 16 & 17\end{array}$
elements [lg]


## closed addressing


h: hash function

## array list

array:

- key and values stored in a list
- ordered by insertion time



## array list

searching a key:

- $\mathrm{O}(n)$ time
- if we sort, insertion becomes O(Ig $n$ ) amortized time (not fast)


## search 3



## google sparse hash

google:

- open addressing
- grouped into dynamic buckets
- a bit vector addresses buckets



## sparse hash table



## compact hashing

Cleary '84:

- open addressing
- $\varphi: K \rightarrow \varphi(\mathrm{~K})$ bijection
- $\varphi(k)=(h(k), r(k))$
- $\varphi^{-1}(h(k), r(k))=k$
- instead of $k$ store $r(k)$
(may need less space than $k$ )


## compact hashing



## Cleary: linear probing

displacement

as a plain array: costs too much space!

## displacement info

representations:

- Cleary '84: $2 m$ bits
- Poyias+ '15:
- Elias y code
- layered array


## $m$ : image size of $h$ <br> = \# cells in H

## displacement info

representations:

- Cleary '84: $2 m$ bits
displacement: 20
- Poyias+ '15:
- Elias y code
- layered array



## memory benchmark

- c: compact
- layered
- max. load factor 0.5
- not space efficient!


## memory benchmark

- c+s: composition of
- compact with
- sparse
- competitive with array



## chain

- composition of
- closed addressing
- array
- compact
- most space efficient
(our contribution)


## chain

- closed addressing
- buckets: instead of lists use two arrays



## chain: space analysis

- a bucket costs $O(\omega)$ bits (pointer + length)
- want $O(n \lg n)$ bits
space for improvement!
$\Rightarrow$ \# buckets: $\mathrm{O}(n / \omega)$
- then $m=n / \omega$ (image size of h)

- $r(k)$ uses $\sim \omega-\lg (n / \omega)=\omega-\lg n+\lg \omega$ bits
- $K=\left[1 . .2^{\omega}\right]$
r(k) of compact
- $n$ : \#elements


## improve space

- want $n$ buckets such that $m=n$
- but each bucket costs $\mathrm{O}(\omega)$ bits!
- idea: maintain buckets in a group (similar to sparse)


## chain $\rightarrow$ grp

- chain represents each bucket separately
- grp uses bit vector to mark bucket boundaries



## rehashing

## chain

- if a bucket reaches
$O(\omega)$ elements
grp
- if a group reaches
$O(\omega)$ elements
- group bit vector has $O(\omega)$ bits,
- scan bit vector naively
we set this maximum bucket / group size to 255 in practice ( $\Rightarrow$ length costs a byte)


## insertion time

chain

- bucket has
$O(\omega)$ elements
$\Rightarrow \mathrm{O}(\omega)$ worst-case time
(assuming that we do not need to rehash)


## query time

## chain

- bucket has
$O(\omega)$ elements $\Rightarrow \mathrm{O}(\omega)$ worst-case time


## grp

- bit vector has O(w) bits
$\Rightarrow$ find respective bucket in $O(1)$ expected time
- bucket size is $\mathrm{O}(1)$ expected
$\Rightarrow \mathrm{O}(1)$ expected time
assume that $\Omega(\omega)$ bits fit into a machine word


## theoretic space bounds

to store $n$ keys from $\mathrm{K}=\left[1 . .2^{\omega}\right]$
we need at least

$$
B:=\lg \binom{2^{\omega}}{n}=n \omega-n \lg n+O(n) \text { bits }
$$

## theoretic space bounds

 $\varepsilon \in(0,1]$ constant|  | construction |  | query |
| :--- | :--- | :--- | :--- |
| hash <br> table | space in bits | time | expected <br> time |
| cleary | $(1+\varepsilon) B+\mathrm{O}(n)$ | $\mathrm{O}\left(1 / \varepsilon^{3}\right)$ exp. | $\mathrm{O}\left(1 / \varepsilon^{2}\right)$ |
| elias | $(1+\varepsilon) B+\mathrm{O}(n)$ | $\mathrm{O}(1 / \varepsilon)$ exp. | $\mathrm{O}(1 / \varepsilon)$ |
| layered | $(1+\varepsilon) B+$ <br> $O(n \lg \lg \lg \lg \mid g n)$ | $\mathrm{O}(1 / \varepsilon)$ exp. | $\mathrm{O}(1 / \varepsilon)$ |
| chain | $B+\mathrm{O}(n \lg \omega)$ | $\mathrm{O}(\omega)$ worst | $\mathrm{O}(\omega)$ worst |
| grp | $B+\mathrm{O}(n)$ | $\mathrm{O}(\omega)$ worst | $\mathrm{O}(1)$ |

## average space per element


chain $\longrightarrow$
cleary $\longrightarrow$
elias $\longrightarrow$
google $\longrightarrow$
grp $\longrightarrow$
layered $\longrightarrow$

- max. load factor $=0.95$
- use sparse layout
- 32 bit keys
- 8 bit values


## construction time


chain $\longrightarrow$
cleary $\longrightarrow$
elias $\longrightarrow$
google $\longrightarrow$
grp $\longrightarrow$
elias is very slow $\rightarrow$ omit it

## construction time




- google is fastest
- grp is always slower than chain
- cleary and layered are slow


## query time



- grp is mostly slower than chain
- google is fastest. cleary and layered have spikes (happening at high load factors)


## experimental summary

|  | construction |  | query |
| :--- | :--- | :--- | :--- |
| hash table | space | time | time |
| google | bad | fast | fast |
| cleary | good | slow | slow |
| elias | good | very slow | very slow |
| layered | average | slow | fast |
| chain | good | fast | slow |
| grp | best | fast | slow |

but sometimes slower than grp at high loads

## proposed two hash tables

- techniques are combination of
- closed addressing
- bucketing [Askitis'09]
- compact hashing [Cleary'84]
- bit vector like in google's sparse table
- characteristics:
- no displacement info
- memory-efficient
- fast construction but
- slow query times
- current research:
- speed up queries with SIMD
- overflow table for averaging the loads of the buckets

