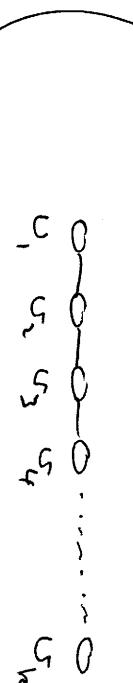


## Persistent B-trees

Persistence : Each update gives a new version of tree  
 Give access to all versions (created so far.).  
 (so similar in spirit to version control ).

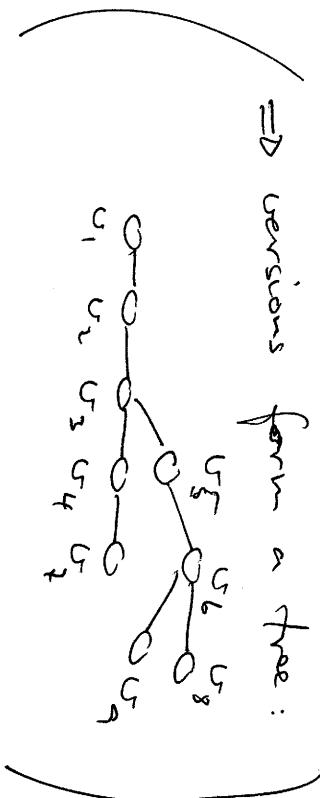
Partial persistence : Search in all versions  
 update in newest only

⇒ versions form a list :



Full persistence : Search in all versions  
 ↴ date →

⇒ versions form a tree :



- + Naive solution : copy structure (entire) at each update
- + We want more efficient solutions (in terms of time and space).
- + Generic solutions for point-based data structures (in Part II) [TODAY: I/O-efficient partial persistent B-trees developed by Pissaloux et al [1989]]

Time :  $t_1 \quad t_2 \quad t_3 \quad t_4 \quad t_5 \dots$

Version : 1 2 3 4 5

Version  $i$  exists in time interval  $[t_i; t_{i+1}]$   
 (i.e., i<sup>th</sup> update starts at time  $t_i$ )

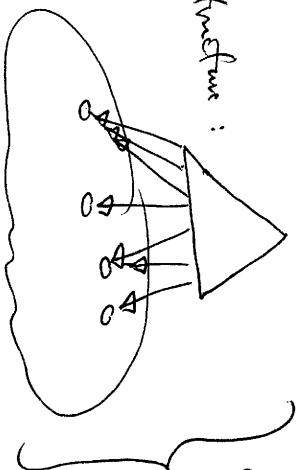
Using  $(t_i, i)$  as  $(\text{key}, \text{value})$ -pair stored  
 in an ordered dictionary, we can find  
 the ~~last~~ number of the version existing  
 at any time  $t$  (by predecessor search on  $t$ ).  
 ↗  
 i.e., non-persistent

Below, we will use a (standard) B-tree  
 as this ordered dictionary, and will  
 call it the access structure.

Except the values will not be version number,  
 stored

but at pointed into the rest of our  
 (persistent B-tree) structure - namely  
 to the correct place to start the search  
 in the version in question

Access structure :  
 Persistent  
 B-tree



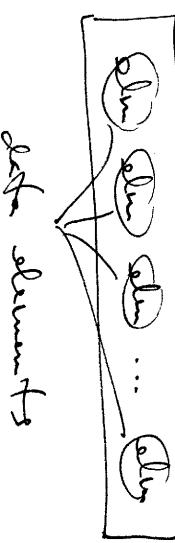
Part :

(2)

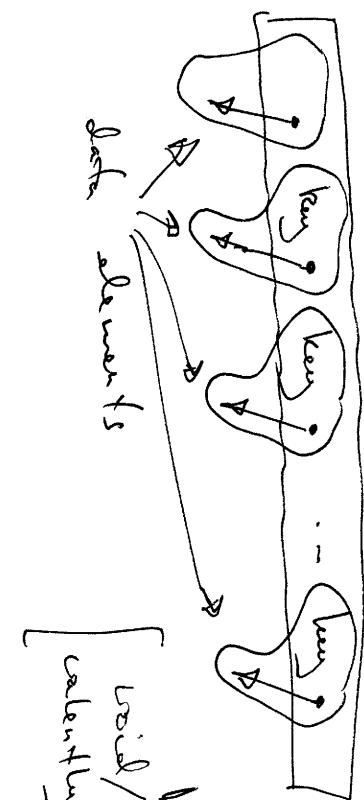
The rest: Let  $b \geq 16$  be a parameter.

The rest of our structure consists of nodes containing data elements up to  $b$

For leaf nodes, the data elements are the elements stored ~~in~~ in our persistent B-tree (i.e., are (key, value) - pairs)



For internal nodes, the data elements are routers (i.e., (key, node-pointer) - pairs).



Keys may be  
void/missing (or, equivalently, be  $-\infty$ )

Hence, "the rest" forms a graph.

Unlike a (standard) B-tree, the graph is not restricted to be a (mimicing) tree. In fact, it will be a DAG.

We choose  $b$  such that a disk block can hold  $b$  data elements ( $b$  is B).

Also different from  $\mathbb{B}$ -trees : each data  
(~~node~~)

element has a time stamp

A timestamp is an interval of the form

$$\text{i)} [t_i; t_j]$$

or

$$\text{ii)} [t_i; \infty[$$

for  $t_i, t_j$  update times. It stores the versions  
for which the data element is valid.

Let  $t$  be the current time (i.e.,  $t \in [t_i; \infty[$   
for  $i$  the (currently) last version).

A data element is said to be alive if  $t$  is  
contained in its timestamp, and dead otherwise

(In fact, it will turn out that alive data elms.  
have the  $[t_i; \infty[$  form of the timestamp,  
and dead elements the other form). from a note

No data element will ever get deleted. Time-  
stamps may change, however (by setting  $\infty \rightarrow t_u$ )  
(at alive nodes)

We call this closing the time-  
stamp.

A data element is valid at (some) time t if it is contained in its timestamp (so alive = valid at current time).

A node is valid if it contains any data elements valid at time t.

The main invariant maintained by the "rest" part of our structure is:

INVARIANT I: For any t, the nodes valid at t and the data elements valid at t together constitute a  $(\frac{b}{4}, b)$  - tree with leaf parameter b, and this tree contains in the leaf nodes exactly the elements stored in the version existing at time t.

In our access structure, the pointer stored as the value attached to  $t_i$  points to the root of the tree of the invariant for  $t = t_i$ .

(6)

Searches : The operation

$\boxed{\text{Search}(k, t)}$

that searches for the element of key  $k$  in version existing at time  $t$ , is now straight-forward :

Search in access structure with  $t$  (predecessor search).

Search as usual in  $(a, b)$ -trees with key  $k$ , starting at root pointed to by pointer returned by first search.

In details:

Each time a node is read, extract the data elms.  
Until at time  $t$ , sort these, view the result as an  $(a, b)$ -tree node and proceed

Each node access is one  $\mathbb{T}/\mathcal{O}$ . Hence, entire

search takes  $\mathcal{O}(\log_{\mathcal{B}}(\mathbb{T})) + \mathcal{O}(\log_{\mathcal{B}}(N_t))$

$$\left( \cancel{\mathcal{O}(\log_{\mathcal{B}}(\mathbb{T}) + \log_{\mathcal{B}}(N_t))} \right) = \mathcal{O}(\log_{\mathcal{B}}(\mathbb{T}))$$

where  $\mathbb{T}$  is the current number of versions (= number of updates so far) and  $N_t$  is the number of elms in version existing at time  $t$ .

$\mathbb{T} \geq N_t$  if we start with empty tree (assumed here)

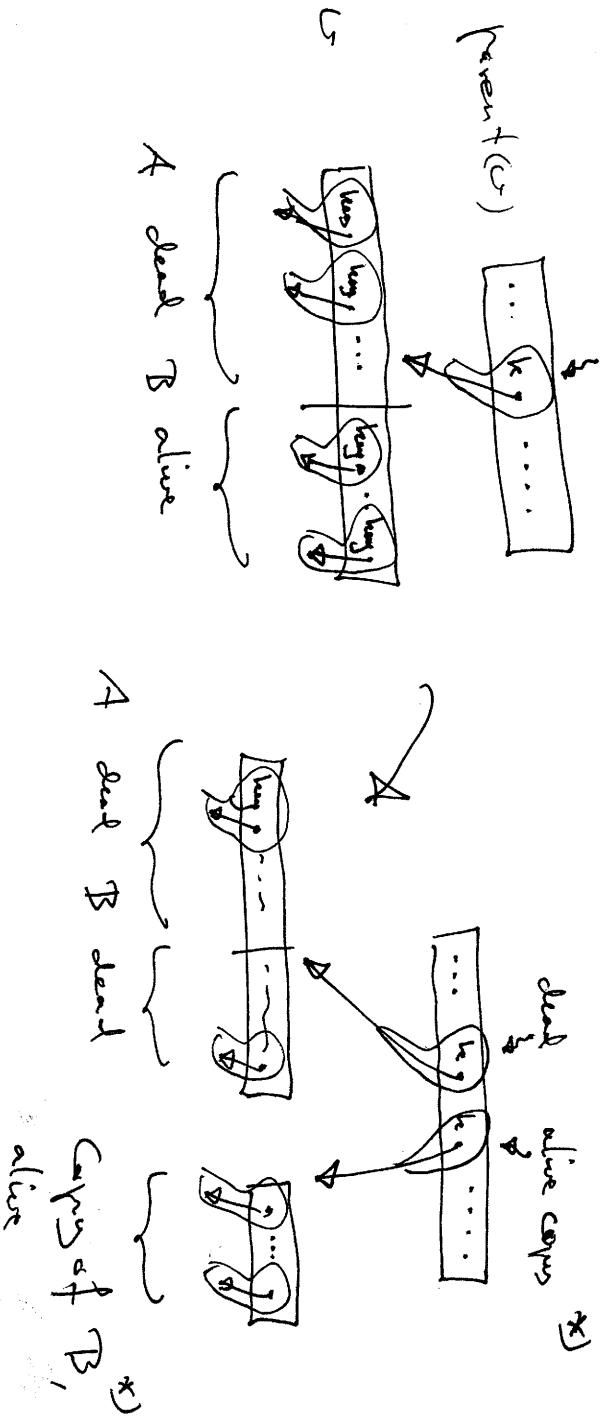
- Notes :
- i) The above is ~~the~~-efficient, but not CPU-optimal. (For this, nodes should contain persistent linking search trees, made using methods from Driscoll et al., which is out of scope here), like e.g. the sorting.
  - ii) If searches are based on ~~version~~ version numbers (instead of time +) directly, the access structure can be simply an array of pointers (using O(1) ~~time~~ to look up).

## Updates

[Note : for updates  $t = \text{current time}$  ( $\Rightarrow$  partial persistence)]

- A basic operation will be the Version Split of a

Node G :



- + Current time is  $t_i$  ( $i$  the number of the new version made by the update)
- + Existing dead timestamps are left untouched
- + The existing alive timestamps are made dead by changing  $[t_j, \alpha]$  to  $[t_j, t_i]$
- + New alive copies get timestamp  $[t_i, \alpha]$
- + Operation will only be involved on search path for update position in current version. Hence the data element of the parent is alive (is assumed in drawing above).

Observation : A version split does not violate the invariant INV 1.

(Proof: only two previous / three new nodes need to be considered. Observe that for any  $t$ , what is valid at time  $t$  is not changed).

To obtain a good space analysis in the end, we introduce the following invariant:

INV 2 : New nodes are created with

$$\frac{3}{8}L \leq \# \text{ data elements } \leq \frac{7}{8}L$$

Also recall the already introduced constraint:

INV 3 : No node set contains more than  $L$  data elements.

We now proceed to define the update operations.

## Insert

Increment version counter  $i$

Log the update time  $t_i$

Search in persistent B-tree for insertion point (using time  $t_{i-1}$ ).

Insert data element in found leaf node with time stamp  $[t_i]$ , i.e [

If needed: rebalance.

(Details below)

Needed : INV 3 may be violated ( $\geq \frac{1}{2} l$  data elements in leaf)

INV 2 may also be violated for  $t_i \leq t$  (a B-tree over flow) ~ but then the above violation also occurs. So enough to check that.

### Relaxance:

~~Version Split~~ on leaf.

Make INV 2 is violated by over flow ( $> \frac{3}{8} l$  data elem. in new node (all alive)): make a standard split (B-tree split) on new node (inserting a new data elem. in parent (with timestamp  $[t_i]$ , i.e [ ) ).

New nodes will have at least

$$\left\lceil \frac{\frac{7}{8}l + 1}{2} \right\rceil \geq \frac{7}{16}l > \frac{3}{8}l \quad \text{data elms.}$$

and at most

$$\left\lceil \frac{l_0 + 1}{2} \right\rceil \leq \frac{l_0}{2} + 1 = l_0 \left( \frac{1}{2} + \frac{1}{l_0} \right) \leq l_0 \left( \frac{1}{2} + \frac{1}{16} \right) < \frac{7}{8}l \quad \text{data elms.}$$

If TNV2 is violated by underflow

( $< \frac{3}{8}L$  data elems. in new node (all alike)):

Find a sibling in  $t_i$ -B-tree (via alive data elems in parent).

Make a version split on this. (This gives between  $t_i$  and  $L$  alive data elems. due to sibling being a valid B-tree node at time  $t_i$  ( $TNV_2$ )).

Make a standard B-tree fuse between the two new nodes.

If result has  $\geq \frac{3}{8}L$  data elems, make a standard B-tree split.

~~Update parent. ("choose a threshold for the fastest, most recent child - within threshold  $t_i, \infty$  for split").~~



Fuse : remove one  
Split : add one again.

After the fuse, the new node has at least

$$\frac{1}{4}L + \frac{1}{4}L = \frac{1}{2}L \geq \frac{3}{8}L$$

(Fused nodes are valid B-tree nodes at time  $t_i$ )

$$\rightarrow \text{Data elems. with no split, it has at most } \frac{7}{8}L$$

After a split, the two new nodes have at least  $\lfloor \frac{7}{8}L + 1 \rfloor > \frac{3}{8}L$  data elems (see previous page). and at

$$\text{most } \left\lceil \frac{\frac{3}{8}L - 1 + L}{2} \right\rceil \leq L\left(\frac{3}{16} + \frac{1}{2}\right) = \frac{11}{16}L < \frac{7}{8}L.$$

Observation: No violations of INV 2 on current level (B-tree level) [i.e. on newly produced nodes]. See calculations above

No violations of INV 2 (only  $t \geq t_i$  need to be considered) or INV 3 (as bounds of INV 2 are stronger), on the current B-tree level.

For  $t_i \geq t$ , INV 1 can be violated on B-tree parent level / node  
 $\Rightarrow$  ( $t_i + 1$  or  $t_i + 2$  alive slns are possible [check cases])

~~INV 3~~ can also ~~be~~ be violated at that node.

(Estimate 0 and 2 new data sln.  
 [check cases]).

Is fixed by recursion on parent!  
 starting with a Version Split on this.

Except that some node size counts may be larger / smaller by one (which doesn't invalidate any conclusions of calculations [check]), the same analysis applies.

Recursion may propagate to rest of  
 $t_i$  -  $\beta$  - tree, creating a new  $t_i$  - root.

Find the last end of insertion) update

access structure [insert ( $t_i$ , pointer to root) ]  
 $\uparrow$   
 new or not.

Deletion is very similar. Start by choosing  
 a timestamp in leaf. Analysis  
 and actions are very similar to  
 insert (actually, few cases)

Bottom : redo the entire analysis (based on a change)  
 at current level [initially leaf level] of  
 $\pm 1$  live data element change  
 $0 \leq k \leq 2$  data element change

(Then analysis of recursive cases and of )

Note: During the recursive rebalancing, rebal.

at a given level is triggered by a i) violation of  $T_{INV} \leq t_i$  (current, alive tree), where B-tree node sizes may be violated, or ii) violation of  $T_{INV} 3$  (too many data elem. in node).

- o New nodes contain between  $\frac{3}{8}b$  and  $\frac{7}{8}b$  alive data elements (and nothing else). So needs  $\frac{1}{8}b$  new data elements at  $\frac{1}{8}b$  changes of number of alive data elements before they trigger.

A node can only trigger once (then made dead by a version split, and only alive nodes (i.e., nodes in current tree) ~~are part of~~ are part of updates.

Each update gives one step on level 0 (in current tree)  
 Each rebal. at level  $i$  gives at most two steps on level  $i+1$  [See 10) and 10) some pages above – the relevant count is max (not sum) of the two types of steps.]

With  $T$  updates ( $= \# \text{ versions}$ ):

$\Rightarrow T$  steps on level 0.

$$\Rightarrow T / \frac{b}{8} = T \cdot \frac{8}{b} \text{ relax. on level 0}$$

$\Rightarrow T \cdot \frac{8}{b} \cdot 2 \text{ steps on level 1}$

$$\Rightarrow T \cdot \frac{8}{b} \cdot 2 / \frac{b}{8} = T \cdot \left(\frac{8}{b}\right)^2 \text{ relax on level 1}$$

$\Rightarrow T \cdot \left(\frac{8 \cdot 2}{b}\right)^2 \text{ steps on level 2}$

$$\Rightarrow T \left(\frac{8 \cdot 2}{b}\right)^2 / \frac{b}{8} = T \cdot \left(\frac{8}{b}\right)^3 \cdot 2 \text{ relax on level 2}$$

$$\text{Total: } = T \cdot \frac{8}{b} \cdot \sum_{i=0}^{\infty} \left(\frac{8 \cdot 2}{b}\right)^i$$

$$= T \cdot \frac{8}{b} \cdot O(1) \text{ as } b > 16$$

Time: Amortized  $O\left(\frac{1}{b}\right)$  relax. ( $= T^{1/3}$ ) per update.

Space: Each relax.  $\Rightarrow$  at most 2 new nodes. So total space  $= 2 \cdot \text{total relax.}$

$$= O(T/b)$$

Special conditions at root :

## Version Split at root :

Access Str. :



A dead  $\otimes$  alias



A dead  $\otimes$  alias  
(closed)

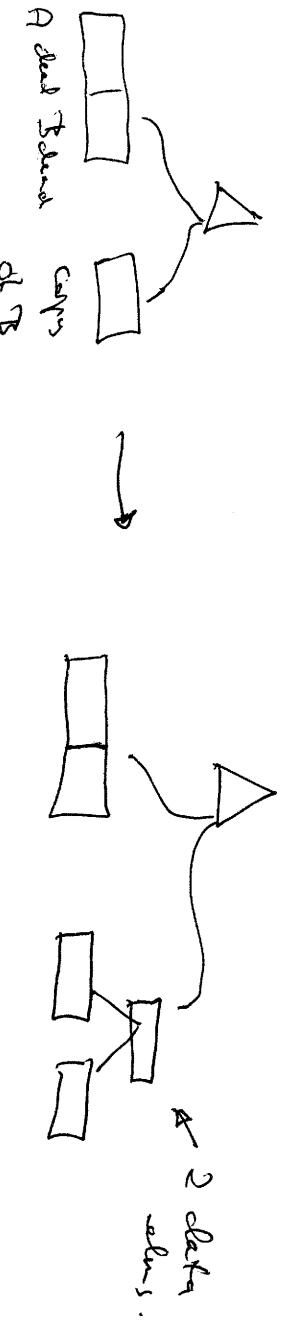
→ new entry,  
key  $t_i$



Copy of  $T$   
 $[t_i, \infty]$

Note that under flow ( $< \frac{3}{8}L$ ) cannot be handled  
(there is no sibling to fuse with).

Also, the over flow case ( $> \frac{3}{8}L$ ) has a split  
which at root gives a node with two data alias:

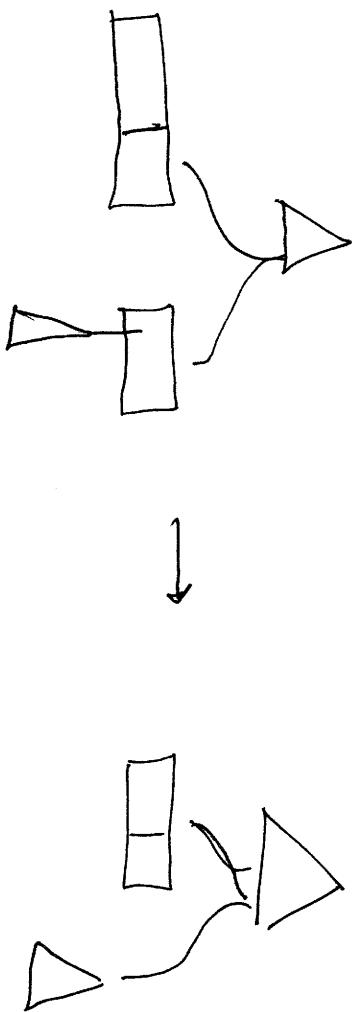


So INV 2 has to have the following addition:

INV 2' : If new node is root of current tree,  
then  $2 = \#$  data alias  $\leq \frac{3}{8}L$

(12)

However,  
 If the under flow of new root (after  
 Version Split) is  $\frac{1}{2}$ , we do as follows :  
 (data does present)



T.e. we remove the node.

(Note that under flow cannot be  $\frac{1}{2}$  data alone  
 present, as the current tree was a valid  
 $B$ -tree before update, and at most 1 child  
 $\xrightarrow{\Delta}$   
 (So root there has  $\geq 2$  children)

was removed by the recursive rebalancing reaching  
 the root.)

The changed TRW 2 affects the analysis of time and space:

The analysis above ~~does~~ ~~really~~ ~~not~~ ~~correct~~ rebalancing at current root triggered by underflow.

Such triggering could happen after 2 (not 1<sup>st</sup>, b) steps in the node [So it does not hold].

However, such rebal. also does not imply steps on the level alone.

So analysis on page (15) is valid for

the rest of the rebal. ops.

(root rebal.  
triggered by underflow)

As such triggering happens at levels  $\geq 2$

(Really, a root at level 0 in B-tree must be allowed down to 0 (not 2) slms),

and requires  $\Omega(1)$  steps, line 4 on page (15)

shows that such rebal. is  $\mathcal{O}(\mathcal{I}/b)$ .

Hence, time and space bounds are still valid.

at page (15), latter.