

# Weekplan: External Memory I

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## References and Reading

- [1] The Input/Output Complexity of Sorting and Related Problems, A. Aggarwal and J. Vitter, CACM 1988. Set  $P = 1$  when reading this.
- [2] Organization and Maintenance of Large Ordered Indexes, R. Bayer, E. McCreight, Acta Inform., 1972.
- [3] Introduction to Algorithms, 3rd edition, Chap. 18, T.H. Cormen, C.E. Leiserson, R.L. Rivest, C. Stein, 2009.

We recommend reading [1] and [3] in detail. [2] is the original paper introducing  $B$ -trees.

## Exercises

**1** [ $w$ ] **Prefix Sum** Given an array  $A$  of  $N$  elements, the *prefix-sum* of  $A$  is the array  $P$  such that  $P[i] = \sum_{j \leq i} A[j]$ . Show how to compute the prefix sum of  $A$  efficiently in external memory

**2** [ $w$ ] **Memory Hierarchy** Determine the configuration of the memory hierarchy on your own computer. Also, what is the cache-inclusion policy?

**3** **Stacks and Queues** Consider stacks and queue in external memory. Solve the following exercises.

**3.1** Show how to efficiently implement a stack in external memory. What is the worst-case and amortized I/Os per operation?

**3.2** Do the same for a queue.

**4** **RAM algorithms in External Memory** We can implement any standard RAM algorithm directly in external memory as follows:

- When we access a piece of data that is not already in internal memory, we move the block containing the input data into internal memory.
- When the internal memory is becomes full, we write the block that contains the *least recently used* (has not been used for the longest amount of time) data back to disk.

Solve the following exercises.

**4.1** Consider your favourite sorting algorithm. What is the I/O complexity of this algorithm if implemented directly in external memory? Compare the result with a good external algorithm.

**4.2** Consider your favourite data structure for searching. What is the I/O complexity of this algorithm if implemented directly in external memory? Compare the result with a good external data structure.

**5** **Multiway Merge Sort Analysis** Carefully analyse the complexity of the multiway merge sort and algorithm and show that it uses  $O(N/B \log_{M/B}(N/B))$  I/Os.

**6 Linked Lists** Consider a data structure that maintains a sequence of elements  $L = e_1, \dots, e_N$  under the following operations:

- $\text{insert}(e, e')$ : Insert element  $e'$  immediately after element  $e$  in the sequential order in  $L$  (extending the length of the sequence by 1).
- $\text{delete}(e)$ : Delete the element  $e$  in  $L$ .
- $\text{traverse}()$ : Report the elements in  $L$  in sequence.

We assume that the arguments  $e$  and  $e'$  are pointers to elements. Show how to efficiently implement the operations in external memory. *Hint*: What is the optimal I/O bound you can hope to achieve for the traverse operation? Try to achieve that.

**7 Range Searching** Suppose we want to extend  $B$ -trees to support the following range searching operations:

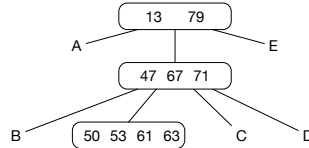
- $\text{report}(i, j)$ : Report all elements with keys  $k$ , such that  $i \leq k \leq j$ .
- $\text{count}(i, j)$ : Return the number of elements with keys  $k$ , such that  $i \leq k \leq j$ .

Solve the following exercises.

**7.1** Show how to efficiently implement report. Your solution should have a good dependency on the size of the output.

**7.2** Show how to efficiently implement count.

**8 Insertions in  $B$ -tree** Consider the following  $B$ -tree of order 4. The capital letters represent subtrees. Show the tree after inserting 59.



**9  $B$ -tree Construction** Show how to efficiently construct a  $B$ -tree from an array of  $N$  elements.

**10 Optimality of  $B$ -trees** Suppose that we want to search among  $N$  keys. Furthermore, suppose that the only way of accessing disk blocks is by following pointers. Show that a search takes at least  $\Omega(\log_B N/M)$  I/Os in the worst case. Also, compare this bound to the  $B$ -tree upper bound. *Hint*: Consider the size  $C_t$  of the set of blocks that can be accessed in at most  $t$  I/Os. Assume that our memory initially is full of pointers.

**11 Dynamic Programming** Let  $S$  and  $T$  be strings of length  $N$  and consider the classic  $O(N^2)$  time solution for computing the longest common subsequence of  $S$  and  $T$ . Show how to implement the algorithm efficiently in external memory.