

CSIEB0100 Data Structures

Lecture 09 Sorting II – External Sorting

Shiow-yang Wu 吳秀陽

Department of Computer Science
and Information Engineering
National Dong Hwa University

Lecture material is mostly home-grown, partly taken from slides came with the textbook originally prepared by Professor Jiun-Long Huang of NCTU.

External Sorting

- Some lists are **too large** to fit in the memory of a computer. So internal sorting is not possible.
- Some **records** are **stored** in the **disk**. System retrieves **a block** of data from a disk **at a time**. A block contains **multiple records**.
- The most popular method for sorting on external storage devices is **merge sort**.
 - **Segments** of the input list are **sorted**.
 - Sorted segments (called **runs**) are **written** onto **external storage**.
 - **Runs** are **merged** until only **one run** is left.

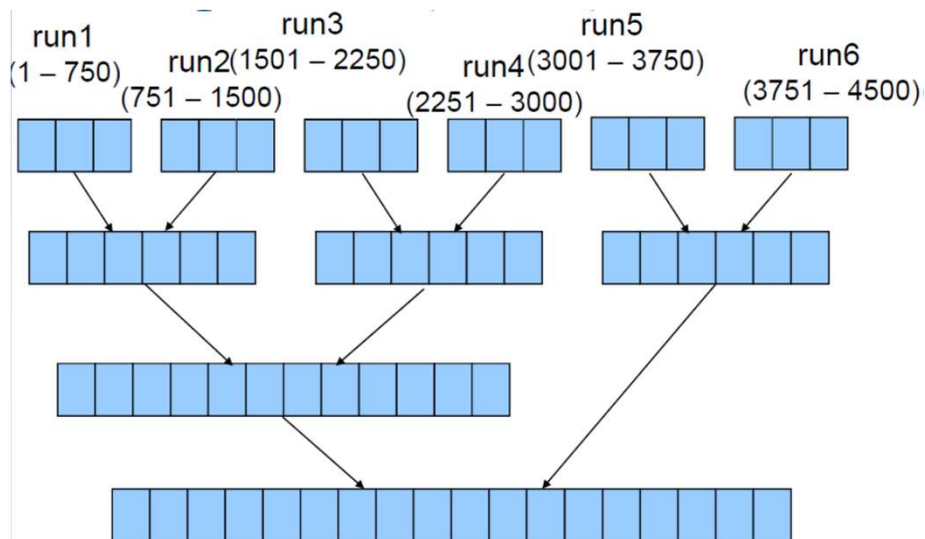
External Sorting Example (7.12)

- Consider a computer which is capable of sorting 750 records is used to sort 4500 records.
- **6 runs** are generated with each run sorting 750 records.
- Allocate **three** 250-record **blocks** of internal memory for performing merging runs. Two for input runs and the last one is for output.
- Three **factors** contributing to the read/write time of disk:
 - **Seek time**: move read/write head to the right cylinder.
 - **Latency time**: time until the right sector is under the head.
 - **Transmission time**: time to transmit data to/from disk

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Example 7.12 (contd.)



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Example 7.12 (contd.)

- $t_{IO} = t_s + t_l + t_{rw}$
 - t_s = maximum seek time
 - t_l = maximum latency time
 - t_{rw} = time to read/write on block of 250 records
- t_{IS} = time to internal sort 750 records
- $n \times t_m$ = time to merge n records from input buffers to the output buffer

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Example 7.12 (contd.)

- Computing time of the external sort

	Operation	Time
(1)	Read 18 blocks of input, $18t_{IO}$, internally sort, $6t_{IS}$, write 18 blocks, $18t_{IO}$	$36t_{IO} + 6t_{IS}$
(2)	Merge runs 1 to 6 in pairs	$36t_{IO} + 4500t_m$
(3)	Merge two runs for 1500 records each, 12 blocks	$24t_{IO} + 3000t_m$
(4)	Merge one run of 3000 records with one run of 1500 records	$36t_{IO} + 4500t_m$
	Total time	$132t_{IO} + 12000t_m + 6t_{IS}$

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K-Way Merging

- To merge m runs via 2-way merging will need $\lceil \log_2 m \rceil + 1$ passes where m is the number of runs
- With k -way merge on m runs, we need $\lceil \log_k m \rceil$ passes over the data.
- If we use higher order merge, the number of passes as well as input/output time would be reduced.

K-Way Merging

- But is it **always true** that the **higher order** of merging, the **less computing time** we will have?
 - **Not necessary!**
 - $k-1$ comparisons are needed to determine the next output.
 - The number of key comparisons is $n(k-1)\log_k m$
 - If loser tree is used to reduce the number of comparisons, we can achieve $O(n \log_2 m)$ complexity
 - The data block size reduced as k increases. Reduced block size implies the increase of data passes (seek and latency times)

Buffer Handling for Parallel Operation

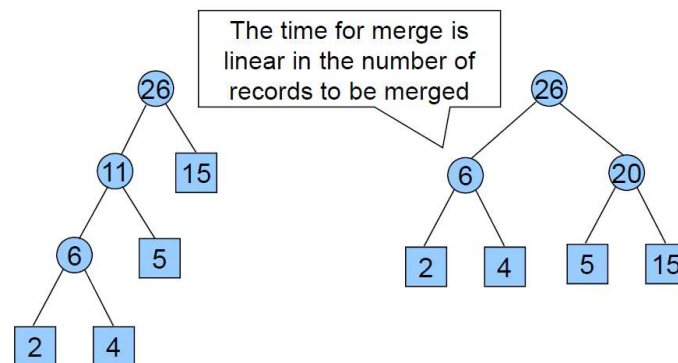
- To achieve better performance, multiple input buffers and two output buffers are used to avoid **idle time**.
- Evenly distributing input buffers among all runs may still have idle time problem. **Buffers** should be **dynamically assigned** to whoever needs to retrieve more data to avoid halting the computing process.
- We should take advantage of **task overlapping** and keep computing process busy and avoid idle time.

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Optimal Merging of Runs

- The runs may not be of the same size. Since the merge time is linear to the run size, we optimize the merging of runs.



$$\begin{aligned} \text{weighted external path length} \\ &= 2*3 + 4*3 + 5*2 + 15*1 \\ &= 43(=6+11+26) \end{aligned}$$

$$\begin{aligned} \text{weighted external path length} \\ &= 2*2 + 4*2 + 5*2 + 15*2 \\ &= 52(=6+20+26) \end{aligned}$$

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Optimal Merging of Runs (contd.)

- The cost of a k -way merge of n runs of length q_i , $1 \leq i \leq n$, is minimized by using a **merge tree** of degree k that has **minimum weighted external path length**.
- A good solution to the problem above has been given by **D. Huffman**. (next slide)

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Huffman Code

- Assume we want to obtain an **optimal set of codes** for messages M_1, M_2, \dots, M_{n+1} . Each code is a **binary string** that will be used for transmission of the corresponding message.
- At receiving end, a **decode tree** is used to decode the binary string and get back the message.
- A **zero** is interpreted as a **left** branch and a **one** as a **right** branch. These codes are called **Huffman codes**.
- The **cost** of decoding a code word is **proportional** to the **number of bits** in the code. This number is equal to the **distance** of the corresponding **external node** from the **root** node.

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Huffman Code (contd.)

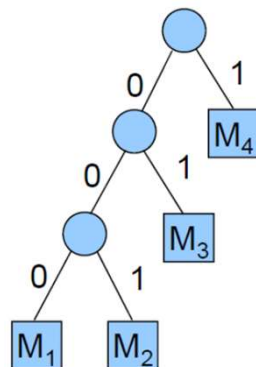
- If q_i is the relative frequency with which message M_i will be transmitted, then the expected decoding time is

$$\sum_{1 \leq i \leq n+1} q_i d_i$$

where d_i is the distance of the external node for message M_i from the root node.

Huffman Code (contd.)

- The expected **decoding time** is **minimized** by choosing code words resulting in a **decode tree** with **minimal weighted external path length**.



Code	Message
1	M_4
01	M_3
001	M_2
000	M_1

BinaryTree Class

```
class BinaryTreeNode {
friend BinaryTree;
private:
    int weight;
    BinaryTreeNode *LeftChild, *RightChild;
};

class BinaryTree {
public:
    int weight();
    BinaryTree(BinaryTree bt1, BinaryTree bt2) {
        root->LeftChild = bt1.root;
        root->RightChild = bt2.root;
        root->weight = bt1.root->weight + bt2.root->weight;
    };
private:
    BinaryTreeNode *root;
}
```

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Huffman Function

```
void huffman(List<BinaryTree> l)
// l is a list of single node binary trees
{
    int n = l.Size(); // number of binary trees in l
    for (int i = 0; i < n-1 ; i++) { // loop n-1 times
        BinaryTree first = l.DeleteMinWeight();
        BinaryTree second = l.DeleteMinWeight();
        BinaryTree *bt = new BinaryTree(first, second);
        l.Insert(bt);
    }
}
```

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Huffman Code Example

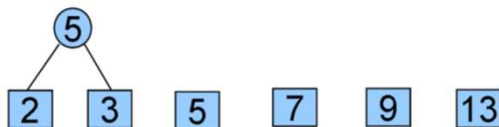
- Input text:
ABBABCCDDE...
- Scan the text to calculate the number of appearances of each character
A: 2, B: 3, C: 5, D: 7, E: 9, F: 13
- Build Huffman tree
- Encode text
1000 1001 1001 ...

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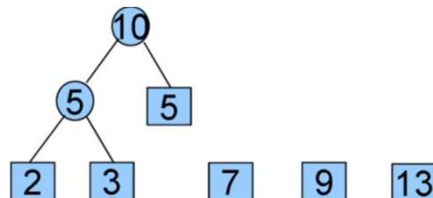
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Huffman Code Example

{(A: 2), (B: 3), (C: 5), (D: 7), (E: 9), (F: 13)}



{(A, B: 5), (C: 5), (D: 7), (E: 9), (F: 13)}



{(D: 7), (E: 9), (A,B,C: 10), (F: 13)}

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Huffman Code Example

{(D: 7), (E: 9), (A,B,C: 10), (F: 13)}

{(A,B,C: 10), (F: 13), (D, E: 16)}

{(D, E: 16), (A,B,C,F: 23)}

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Huffman Code Example

{(D, E: 16), (A,B,C,F: 23)}

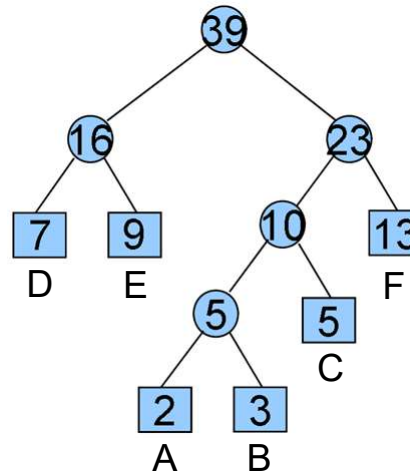
{(A, B, C, D, E, F: 39)}

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Huffman Code Example

- The code table

Symbol	Code
A	1000
B	1001
C	101
D	00
E	01
F	11



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Optimal Merging with Huffman Tree

- We can use Huffman Code Method to get the optimal merging order.
- Consider the run length q_i as the weight of run R_i .
- Combine all runs into a list.
- Call the Huffman function (p.16)
- The final tree is the optimal merge pattern.
- Try to devise an example and test it.
- It is more efficient to use a min-heap instead of a list. (how?)

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Complexity Analysis

- In each iteration, two DeleMin and one Insert is performed. The total time is
$$T(n) = O(n-1) \times \max(O(\text{DeleMin}), O(\text{Insert}))$$
- If list is **not sorted**, then $O(\text{DeleMin})=O(n)$, $O(\text{Insert})=1$, so $T(n) = (n-1) \times n = O(n^2)$.
- If list is **sorted** in an **array**, then $O(\text{DeleMin})=O(1)$, $O(\text{Insert})=O(n)$, so $T(n) = (n-1) \times n = O(n^2)$.
- If list is organized as a **min-heap**, then $O(\text{DeleMin})=O(1)$, $O(\text{Insert})=O(\log n)$, so $T(n) = (n-1) \times \log n = O(n \log n)$.