## Fast BWT in Small Space by Blockwise Suffix Sorting

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The usual way to compute the Burrows-Wheeler transform (BWT) [3] of a text is by constructing the suffix array of the text. Even with space-efficient suffix array construction algorithms [12, 2], the space requirement of the suffix array itself is often the main factor limiting the size of the text that can be handled in one piece, which is crucial for constructing compressed text indexes [4, 5]. Typically, the suffix array needs 4n bytes while the text and the BWT need only n bytes each and sometimes even less, for example 2n bits each for a DNA sequence.

We reduce the space dramatically by constructing the suffix array in *blocks* of lexicographically consecutive suffixes. Given such a block, the corresponding block of the BWT is trivial to compute.

**Theorem 1** The BWT of a text of length n can be computed in  $\mathcal{O}(n \log n + n\sqrt{v} + D_v)$  time (with high probability) and  $\mathcal{O}(n/\sqrt{v} + v)$  space (in addition to the text and the BWT), for any  $v \in [1, n]$ . Here  $D_v = \sum_{i \in [0, n)} \min(d_i, v) = \mathcal{O}(nv)$ , where  $d_i$  is the length of the shortest unique substring starting at i.

Proof (sketch). Assume first that the text has no repetitions longer than v, i.e.,  $d_i \leq v$  for all i. Choose a set of  $\mathcal{O}(v)$  random suffixes that divide the suffix array into blocks. The sizes of the blocks are counted in  $\mathcal{O}(n \log v + D_v)$  time using the string binary search technique from [11]. Blocks are then combined to obtain  $\mathcal{O}(\sqrt{v})$  blocks of size  $\mathcal{O}(n/\sqrt{v})$ . The suffixes in a block are collected in  $\mathcal{O}(n)$  time and  $\mathcal{O}(v)$  extra space using a modified Knuth–Morris–Pratt algorithm with (the prefixes of) the bounding suffixes as patterns. A block B is sorted in-place in  $\mathcal{O}(|B|\log|B| + D_v(B))$  time using the multikey quicksort [1], where  $D_v(B)$  is as  $D_v$  but summed over the suffixes in B. Repetitions longer than v are handled in all stages with the difference cover sampling (DCS) data structure from [2] that supports constant time order comparison of any two suffixes that have a common prefix of length v. The DCS data structure can be constructed in  $\mathcal{O}((n/\sqrt{v})\log(n/\sqrt{v}) + D_v(C))$  time and  $\mathcal{O}(n/\sqrt{v} + v)$  space, where C is a set of  $\mathcal{O}(n/\sqrt{v})$  suffixes.

With the choice of  $v = \log^2 n$ , we get an algorithm using  $\mathcal{O}(n)$  bits of space and running in  $\mathcal{O}(n \log n)$  time on average and in  $\mathcal{O}(n \log^2 n)$  time in the worst case. The algorithm is also fast and space-efficient in practice. The following table shows the space requirement of a practical implementation for some v (not including the text, the BWT and about  $16v + \mathcal{O}(\log n)$  bytes).

For small v, the runtime is dominated by the sorting of blocks making the performance similar to the algorithm in [2], which is competitive with the best algorithms. For larger v, the time needed for the  $\mathcal{O}(\sqrt{v})$  scans to collect suffixes for a block takes over. The  $D_v$  term is dominant only in pathological cases.

There are two other categories of algorithms for computing the BWT when there is not enough space for the suffix array: compressed suffix array construction [10, 6, 7] and external memory suffix array construction [8, 9]. Our guess is that the blockwise suffix sorting is the fastest alternative in practice when v is not too large, and we are in the process of verifying this experimentally.

## References

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