# Report of experiments

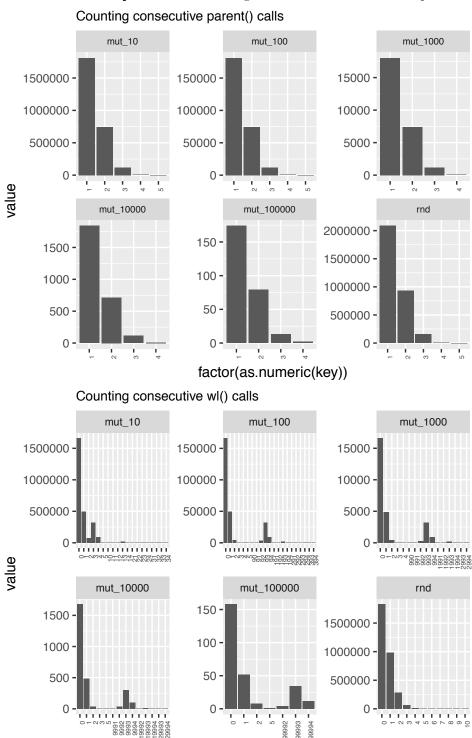
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## 1 Input properties

For various types ("mut\_XMs\_YMt\_Z" means s and t are random identical strings of length X, and Y million respectively with mutations inserted every Z characters. "rnd\_XMs\_YMt" means s and t are random strings of length X, and Y million respectively) of inputs run the MS algorithm and count the number of consecutive wl() or parent() calls during the runs or ms construction phase.



factor(as.numeric(key))

Table 1: Composition of the runs vector for various input types.

| vector_value | mut_10  | mut_100 | mut_1000 | mut_10000 | mut_100000 | rnd     |
|--------------|---------|---------|----------|-----------|------------|---------|
| 0            | 2676093 | 267660  | 26674    | 2680      | 269        | 3181026 |
| 1            | 2323907 | 4732340 | 4973326  | 4997320   | 4999731    | 1818974 |

# 2 Double vs. single rank

#### 2.1 Code

The single rank and double rank implementations in sdsl: rank support v.hpp link // RANK(idx) const uint64\_t\* p = m\_basic\_block.data() + ((idx>>8)&0xFFFFFFFFFFFFFEULL); return \*p + ((\*(p+1)>>(63 - 9\*((idx&0x1FF)>>6)))&0x1FF) +(idx&0x3F ? trait\_type::word\_rank(m\_v->data(), idx) : 0); // DOUBLE RANK OD(i, j)  $if((i>>8) == (j>>8)){$ res.first = \*p + ((\*(p+1))>(63 - 9\*((i&0x1FF))>6)))&0x1FF) +(i&0x3F ? trait\_type::word\_rank(m\_v->data(), i) : 0); res.second = \*p + ((\*(p+1))>(63 - 9\*((j&0x1FF))>6)))&0x1FF) +(j&0x3F ? trait\_type::word\_rank(m\_v->data(), j) : 0); } else { res.first = \*p + ((\*(p+1))>(63 - 9\*((i&0x1FF)>>6)))&0x1FF) +(i&0x3F ? trait\_type::word\_rank(m\_v->data(), i) : 0); res.second = \*p + ((\*(p+1))>(63 - 9\*((j&0x1FF))>6)))&0x1FF) +(j&0x3F ? trait\_type::word\_rank(m\_v->data(), j) : 0); } return res // DOUBLE RANK FC(i, j) const uint64\_t\* b = m\_basic\_block.data(); return (\*pi + ((\*(pi+1)>>(63 - 9\*((i&0x1FF)>>6)))&0x1FF) + (i&0x3F ? trait\_type::word\_rank(m\_v->data(), i) : 0), \*pj + ((\*(pj+1)>>(63 - 9\*((j&0x1FF)>>6)))&0x1FF) +(j&0x3F ? trait\_type::word\_rank(m\_v->data(), j) : 0));

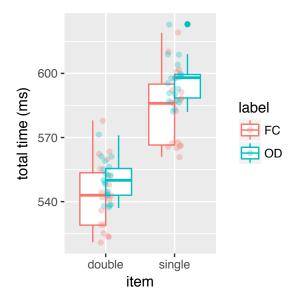
#### 2.2 Performance

Table 2: Time (in ms) of 500K calls to wl() based on single\_rank() or double\_rank() methods on 100MB random DNA input; Mean/sd over 20 repetitions.

| item   | label | $avg\_time$ | sd_time |
|--------|-------|-------------|---------|
| double | FC    | 543.11      | 15.88   |
| double | OD    | 550.00      | 9.27    |
| single | FC    | 584.32      | 17.11   |
| single | OD    | 596.37      | 10.20   |
|        |       |             |         |

Table 3: FC vs. OD implementations. Absolute (FC / OD) and relative (100 \* |FC - OD| / OD) ratios of average times

| item   | FC     | OD     | abs_ratio | rel_ratio |
|--------|--------|--------|-----------|-----------|
| double | 543.11 | 550.00 | 0.99      | 1.25      |
| single | 584.32 | 596.37 | 0.98      | 2.02      |



# 3 Lazy vs non-lazy

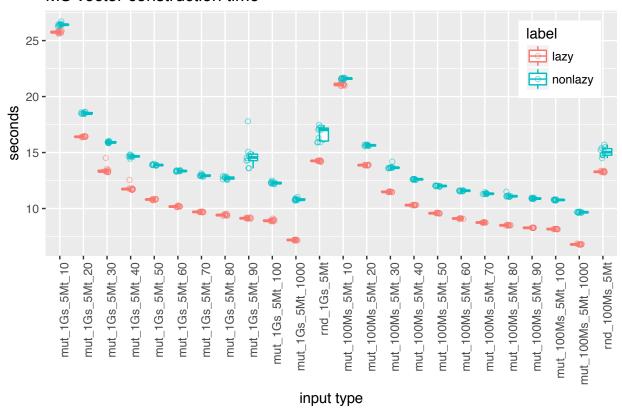
#### 3.1 Code

The lazy and non-lazy versions differ in a couple of lines of code as follows

```
if(flags.lazy){
    for(; I.first <= I.second && h_star < ms_size; ){</pre>
        c = t[h_star];
        I = bstep_interval(st, I, c); //I.bstep(c);
        if(I.first <= I.second){</pre>
            v = st.lazy_wl(v, c);
            h_star++;
        }
    }
    if(h_star > h_star_prev) // // we must have called lazy_wl(). complete the node
        st.lazy_wl_followup(v);
} else { // non-lazy weiner links
    for(; I.first <= I.second && h_star < ms_size; ){</pre>
        c = t[h_star];
        I = bstep_interval(st, I, c); //I.bstep(c);
        if(I.first <= I.second){</pre>
            v = st.wl(v, c);
            h_star++;
        }
    }
}
```

#### 3.2 Performance

## MS vector construction time



The right panel shows the time to construct the **runs** vector. This stage is the same for both versions and is shown as a control. On the left panel it can be seen that speedup correlates positively with both the size of the indexed string and the mutation period.

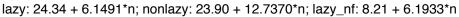
### 3.3 Sandbox timing

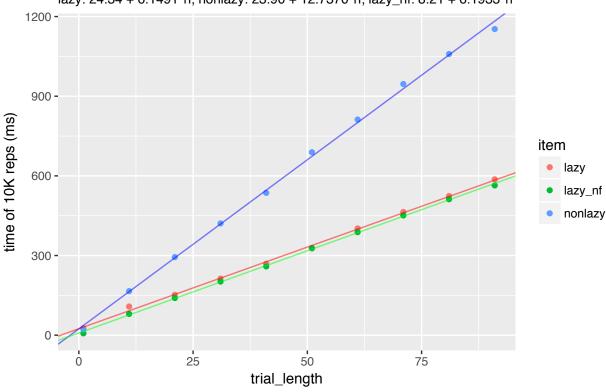
Measure the time of 10k repetitions of

- (lazy) n consecutive lazy\_wl() calls followed by a lazy\_wl\_followup()
- (nonlazy) n consecutive wl() calls
- (lazy\_nf) n consecutive lazy\_wl() calls

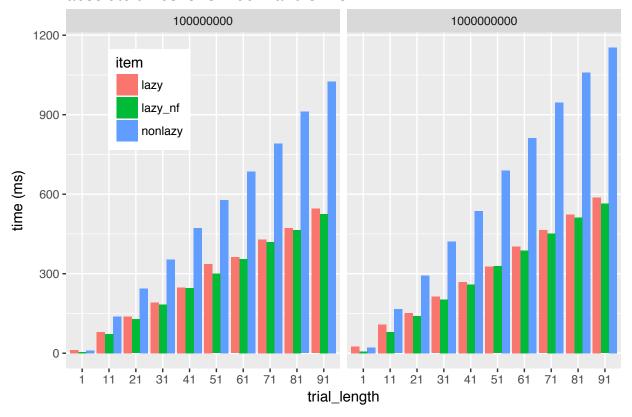
```
// lazy
for(size_type i = 0; i < trial_length; i++)
    v = st.lazy_wl(v, s_rev[k--]);
if(h_star > h_star_prev) // // we must have called lazy_wl(). complete the node
    st.lazy_wl_followup(v);
...
// non-lazy
for(size_type i = 0; i < trial_length; i++)
    v = st.wl(v, s_rev[k--]);
...
// lazy_nf
for(size_type i = 0; i < trial_length; i++)
    v = st.lazy_wl(v, s_rev[k--]);</pre>
```

### indexed input size 1G





#### absolute times for s=100M and s=1G



#### 3.4 Check

In the experiments above we ran the program with the "lazy" or "non-lazy" flag and measured. The total time of each experiment can be written as  $t_l = l_l + a$  and  $t_n = l_n + a$  for the two versions respectively; only the ts being known. Furthermore, we have  $\hat{l}_l$  and  $\hat{l}_n$  estimations – computed by combining the time / wl call with the number of with the count of wl calls in each input (Section "Input Properties"). Hence we should expect

$$\delta t = t_l - t_n = l_l + a - l_n - a = l_l - l_n \approx \delta \hat{l} = \hat{l}_l - \hat{l}_n$$

| h noth                | <sub>4</sub> 1 | 4 50  | 1 1  | 1    | dalta t | dalta 1 hat |
|-----------------------|----------------|-------|------|------|---------|-------------|
| b_path                | t_l            | t_n   | l_l  | l_n  | delta_t | delta_l_hat |
| $mut\_100Ms\_5Mt\_10$ | 21.12          | 21.61 | 8.56 | 6.16 | -0.49   | 2.39        |
| mut_100Ms_5Mt_100     | 8.16           | 10.77 | 3.36 | 4.33 | -2.60   | -0.97       |
| mut_100Ms_5Mt_1000    | 6.80           | 9.67  | 2.84 | 4.15 | -2.86   | -1.31       |
| $mut\_100Ms\_5Mt\_20$ | 13.87          | 15.64 | 5.66 | 5.14 | -1.77   | 0.52        |
| $mut\_100Ms\_5Mt\_30$ | 11.49          | 13.70 | 4.71 | 4.81 | -2.21   | -0.10       |
| $mut\_100Ms\_5Mt\_40$ | 10.31          | 12.60 | 4.22 | 4.64 | -2.30   | -0.41       |
| $mut\_100Ms\_5Mt\_50$ | 9.58           | 12.01 | 3.93 | 4.53 | -2.43   | -0.60       |
| $mut\_100Ms\_5Mt\_60$ | 9.11           | 11.58 | 3.74 | 4.47 | -2.48   | -0.72       |
| $mut\_100Ms\_5Mt\_70$ | 8.75           | 11.34 | 3.60 | 4.42 | -2.59   | -0.81       |
| $mut\_100Ms\_5Mt\_80$ | 8.51           | 11.13 | 3.50 | 4.38 | -2.63   | -0.88       |
| mut_100Ms_5Mt_90      | 8.28           | 10.90 | 3.42 | 4.35 | -2.62   | -0.93       |
| $mut\_1Gs\_5Mt\_10$   | 25.75          | 26.43 | 7.57 | 6.65 | -0.68   | 0.92        |
| $mut\_1Gs\_5Mt\_100$  | 8.94           | 12.29 | 3.49 | 4.90 | -3.35   | -1.41       |

| b_path              | t_1   | t_n   | 1_1  | l_n  | delta_t | delta_l_hat |
|---------------------|-------|-------|------|------|---------|-------------|
| mut_1Gs_5Mt_1000    | 7.19  | 10.82 | 3.08 | 4.72 | -3.63   | -1.64       |
| $mut\_1Gs\_5Mt\_20$ | 16.42 | 18.52 | 5.30 | 5.68 | -2.10   | -0.37       |
| $mut\_1Gs\_5Mt\_30$ | 13.46 | 15.92 | 4.55 | 5.36 | -2.46   | -0.81       |
| $mut\_1Gs\_5Mt\_40$ | 11.81 | 14.66 | 4.17 | 5.20 | -2.85   | -1.02       |
| $mut\_1Gs\_5Mt\_50$ | 10.81 | 13.89 | 3.95 | 5.10 | -3.08   | -1.15       |
| $mut\_1Gs\_5Mt\_60$ | 10.19 | 13.36 | 3.80 | 5.03 | -3.17   | -1.24       |
| $mut\_1Gs\_5Mt\_70$ | 9.70  | 12.95 | 3.69 | 4.99 | -3.26   | -1.30       |
| $mut\_1Gs\_5Mt\_80$ | 9.43  | 12.72 | 3.61 | 4.95 | -3.29   | -1.35       |
| $mut\_1Gs\_5Mt\_90$ | 9.14  | 14.74 | 3.55 | 4.93 | -5.60   | -1.38       |
| $rnd\_100Ms\_5Mt$   | 13.29 | 15.07 | 9.65 | 6.55 | -1.78   | 3.10        |
| $rnd_1Gs_5Mt$       | 14.25 | 16.72 | 8.20 | 6.92 | -2.48   | 1.28        |

The numbers are not identical (process dependent factors might influence the running time of function calls), but they are correlated  $(corr(\delta t, \delta \hat{l}) = 0.71)$ .

#### 4 Double rank and fail

#### 4.1 Code

```
// Given subtree_double_rank(v, i, j) -> (a.first, a.second) -- to simplify code
// DOUBLE RANK: int i, int j, char c
p = bit_path(c)
result_i, result_j = i, j;
node_type v = m_tree.root();
for (1 = 0; 1 < path_len; ++1, p >>= 1) {
 a = subtree_double_rank(v, m_tree.bv_pos(v) + result_i, m_tree.bv_pos(v) + result_j);
  if(p&1){ // left child
      if(result_i > 0) result_i = a.first;
      if(result_j > 0) result_j = a.second;
  } else { // right child
      if(result_i > 0) result_i -= a.first;
      if(result_j > 0) result_j -= a.second;
 v = m_tree.child(v, p&1); // goto child
return(result_i, result_j)
// DOUBLE RANK AND FAIL
p = bit_path(c)
result_i, result_j = i, j;
node_type v = m_tree.root();
for (1 = 0; 1 < path_len; ++1, p >>= 1) {
  a = subtree_double_rank(v, m_tree.bv_pos(v) + result_i, m_tree.bv_pos(v) + result_j);
  if(p&1){ // left child
      if(result_i > 0) result_i = a.first;
      if(result_j > 0) result_j = a.second;
  } else { // right child
      if(result_i > 0) result_i -= a.first;
      if(result_j > 0) result_j -= a.second;
  if(result_i == result_j) // Weiner Link call will fail
   return(0, 0)
  v = m_tree.child(v, p&1); // goto child
return(result_i, result_j)
```

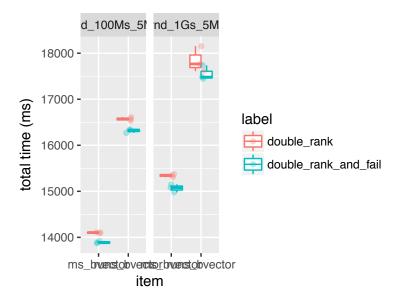
#### 4.2 Performance

Table 5: Time (in ms) of 500K calls to wl() based on single\_rank() or double\_rank() methods on 100MB random DNA input; Mean/sd over 20 repetitions.

| item            | label                | b_path            | $avg\_time$ | sd_time |
|-----------------|----------------------|-------------------|-------------|---------|
| ms_bvector      | double_rank          | $rnd\_100Ms\_5Mt$ | 14101.33    | 12.22   |
| $ms\_bvector$   | $double\_rank$       | $rnd\_1Gs\_5Mt$   | 15342.67    | 35.30   |
| $ms\_bvector$   | double_rank_and_fail | $rnd\_100Ms\_5Mt$ | 13893.33    | 27.23   |
| $ms\_bvector$   | double_rank_and_fail | $rnd\_1Gs\_5Mt$   | 15068.67    | 87.37   |
| $runs\_bvector$ | $double\_rank$       | $rnd\_100Ms\_5Mt$ | 16572.33    | 36.30   |
| $runs\_bvector$ | $double\_rank$       | $rnd\_1Gs\_5Mt$   | 17843.33    | 281.09  |
| $runs\_bvector$ | double_rank_and_fail | $rnd\_100Ms\_5Mt$ | 16315.00    | 42.33   |
| runs_bvector    | double_rank_and_fail | $rnd\_1Gs\_5Mt$   | 17553.00    | 158.64  |

Table 6: Single vs. double rank. Absolute (double / single) and relative (100 \* |double - single| / single) ratios of average times.

| item            | b_path            | double_rank | double_rank_and_fail | abs_ratio | rel_ratio |
|-----------------|-------------------|-------------|----------------------|-----------|-----------|
| ms_bvector      | $rnd\_100Ms\_5Mt$ | 14101.33    | 13893.33             | 0.99      | 1.48      |
| $ms\_bvector$   | $rnd\_1Gs\_5Mt$   | 15342.67    | 15068.67             | 0.98      | 1.79      |
| $runs\_bvector$ | $rnd\_100Ms\_5Mt$ | 16572.33    | 16315.00             | 0.98      | 1.55      |
| $runs\_bvector$ | $rnd\_1Gs\_5Mt$   | 17843.33    | 17553.00             | 0.98      | 1.63      |



#### 5 Parallelization

#### 5.1 Code

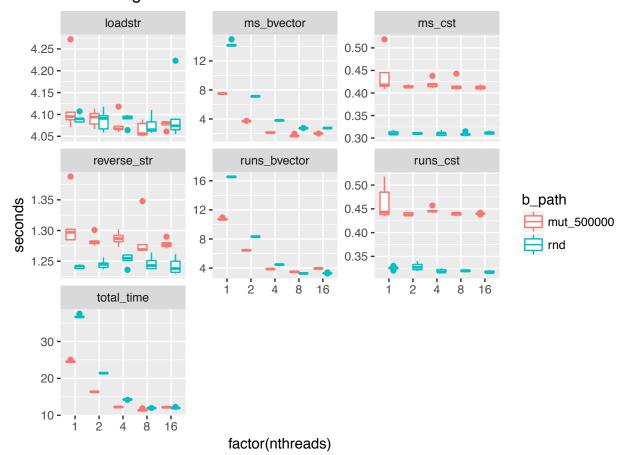
See the pseudo-code in the repo (link)

#### 5.2 Performance

Run the MS construction program on the same input (random strings s of length 100M and t of length 5M) with varying parallelization degree (nthreads = number of threads).

The time is reported over 5 runs for each fixed number of threads.

#### Time usage



Space in MB for the same settings as above.

Each thread allocates its own ms vector with initial size |t|/nthreads then it resizes by a factor of 1.5 each time it needs to. Resizing will always result in a vector smaller than 2|t| elements.

