

Parallel Breadth First Search

Yonatan Fogel
Computer Science
Stony Brook University
Stony Brook, New York, 11744
Email: yfogel@cs.sunysb.edu

Abstract—This is an $n - 1$ level abstract

I. INTRODUCTION

A. Subsection Heading Here

Subsection text here.

1) Subsubsection Heading Here: Subsubsection text here.

II. RELATED WORK

[1]

III. PPS(RENAME)

Parallel prefix sum

IV. BFS(RENAME)

BFS algo

```
parallel for u gets 0 .. n - 1

parallel for i = 0 to p-1
  if i = 0
    var{offset} = 0
  else
    var{offset} = D[\frac{iN}{p}]
  var{offset}
```

V. ANALYSIS

VI. CONCLUSION

VII. FUTURE WORK

ACKNOWLEDGMENT

The authors would like to thank...

REFERENCES

- [1] C. E. Leiserson and T. B. Schardl, "A work-efficient parallel breadth-first search algorithm (or how to cope with the nondeterminism of reducers)," in *Proceedings of the 22nd ACM symposium on Parallelism in algorithms and architectures*, ser. SPAA '10. New York, NY, USA: ACM, 2010, pp. 303–314. [Online]. Available: <http://doi.acm.org/10.1145/1810479.1810534>

```

SERIAL-PREFIX-SUM( V, start, limit )
1)  V[start]  $\leftarrow$  V[start] + partial_sum
2)  for i  $\leftarrow$  start + 1 to limit - 1 do
3)    V[i]  $\leftarrow$  V[i] + V[i - 1]
4)  return V[limit - 1]

PARALLEL-PREFIX-SUM-UP( V, GRAIN-SIZE, start, limit )
1)  size  $\leftarrow$  limit - start
2)  if size  $\leq$  GRAIN-SIZE then
3)    return SERIAL-PREFIX-SUM( V, start, limit )
4)  else
5)    mid  $\leftarrow$   $\lfloor \frac{start+limit}{2} \rfloor$ 
6)    x  $\leftarrow$  spawn PARALLEL-PREFIX-SUM-UP( V, GRAIN-SIZE, start, mid )
7)    y  $\leftarrow$  PARALLEL-PREFIX-SUM-UP( V, GRAIN-SIZE, mid, limit )
8)    sync
9)    V[limit - 1]  $\leftarrow$  x + y
10)   return x + y

SERIAL-PREFIX-SUM-DOWN( V, start, limit, rightmost_excluded, partial_sum )
1)  for i  $\leftarrow$  start to limit - 2 do
2)    V[start]  $\leftarrow$  V[start] + partial_sum
3)  if  $\neg$ rightmost_excluded then
4)    V[limit - 1]  $\leftarrow$  V[limit - 1] + partial_sum

PARALLEL-PREFIX-SUM-DOWN( V, start, limit, rightmost_excluded, partial_sum )
1)  size  $\leftarrow$  limit - start
2)  if size  $\leq$  GRAIN-SIZE then
3)    SERIAL-PREFIX-SUM-DOWN( V, start, limit, partial_sum, rightmost_excluded )
4)    return
5)  else
6)    mid  $\leftarrow$   $\lfloor \frac{start+limit}{2} \rfloor$ 
7)    sum_left  $\leftarrow$  V[mid - 1]
8)    spawn PARALLEL-PREFIX-SUM-DOWN( V, GRAIN-SIZE, start, mid, false, partial_sum )
9)    if  $\neg$ rightmost_excluded then
10)     V[limit - 1]  $\leftarrow$  V[limit - 1] + partial_sum
11)    if limit - mid > 1
12)     PARALLEL-PREFIX-SUM-DOWN( V, GRAIN-SIZE, mid, limit, true, partial_sum + sum_left )

PARALLEL-PREFIX-SUM( V, GRAIN-SIZE )
V[0 : n - 1] is a sequence of n integers. This function replaces V[i] with  $\sum_{0 \leq j \leq i} V[j]$ 
1)  if |V| > 1 then
2)    PARALLEL-PREFIX-SUM-UP( V, GRAIN-SIZE, 0, n )
3)    PARALLEL-PREFIX-SUM-DOWN( V, GRAIN-SIZE, 0, n, false, 0 )

```

Fig. 1. Overwrite $V[0 : n - 1]$ with its prefix sum.

```

FIND-SUBLIST( WORK, W, p )
1)   $p_n \leftarrow \text{MIN}( p, N )$ 
2)   $\text{SUBLIST} \leftarrow \text{array}[0 : p - 1]$ 
3)   $\text{RANGESSTART} \leftarrow \text{array}[0 : p_n - 1]$ 
4)   $\text{RANGESEND} \leftarrow \text{array}[0 : p_n - 1]$ 
5)  parallel for  $i \leftarrow 0$  to  $p_n - 1$  do
6)      if  $i = 0$  then
7)           $\text{FIRSTDEGREE} \leftarrow 0$ 
8)      else
9)           $\text{FIRSTDEGREE} \leftarrow \text{WORK}[\lfloor \frac{iN}{p_n} \rfloor - 1]$ 
10)          $\text{FIRSTDEGREENEXT} \leftarrow \text{WORK}[\lfloor \frac{(i+1)N}{p_n} \rfloor - 1]$ 
11)          $\text{RANGESSTART}[i] \leftarrow \lfloor \frac{p_n \cdot \text{FIRSTDEGREE}}{W} \rfloor$ 
12)          $\text{RANGESEND}[i] \leftarrow \lfloor \frac{p_n \cdot \text{FIRSTDEGREENEXT}}{W} \rfloor - 1$ 
13)  parallel for  $i \leftarrow 0$  to  $p_n - 1$  do
14)      if  $\text{RANGESSTART}[i] \leq \text{RANGESEND}[i]$  then
15)          parallel for  $j \leftarrow \text{RANGESSTART}[i]$  to  $\text{RANGESEND}[i]$  do
16)               $\text{SUBLIST}[j] \leftarrow i$ 
17)  return  $\text{SUBLIST}$ 

LEVEL-TO-QUEUES( INPUT, WORK, SUBLIST, D,  $\Gamma$ ,  $\gamma$ , W, p, LEVEL )
1)   $Q \leftarrow \text{array}[0 : p - 1]$ 
2)  parallel for  $i \leftarrow 0$  to  $p - 1$  do
3)       $Q[i].\text{CLEAR}()$ 
4)       $\text{FIRSTDEGREE} \leftarrow \lfloor \frac{iW}{p} \rfloor$ 
5)       $\text{WORKITEMS} \leftarrow \lfloor \frac{(i+1)W}{p} \rfloor - \text{FIRSTDEGREE}$ 
6)       $\text{VERTEX} \leftarrow \text{BINARY-SEARCH-FOR-INDEX}( \text{WORK}, \lfloor \frac{N \cdot \text{SUBLIST}[i]}{p} \rfloor, \lfloor \frac{N \cdot (\text{SUBLIST}[i] + 1)}{p} \rfloor, \text{FIRSTDEGREE} + 1 )$ 
7)       $\text{DEGREE} \leftarrow \text{FIRSTDEGREE} - \text{WORK}[\text{VERTEX} - 1]$ 
8)      while  $\text{WORKITEMS} > 0$  do
9)           $u \leftarrow \text{INPUT}[\text{VERTEX}]$ 
10)          $\text{LIMIT} \leftarrow \text{MIN}( \text{WORKITEMS} + \text{DEGREE}, \gamma[u] )$ 
11)         for  $j \leftarrow \text{DEGREE}$  to  $\text{LIMIT}$  do
12)              $v \leftarrow \Gamma[u][j]$ 
13)             if  $D[v] = \infty$  then
14)                  $D[v] \leftarrow \text{LEVEL}$ 
15)                  $\text{OWNER}[v] \leftarrow i$ 
16)                 if  $\gamma[v] > 0$  then
17)                      $Q[i].\text{ENQUEUE}( v )$ 
18)              $\text{WORKITEMS} \leftarrow \text{WORKITEMS} - \text{DEGREE}$ 
19)              $\text{DEGREE} \leftarrow 0$ 
20)              $\text{VERTEX} \leftarrow \text{VERTEX} + 1$ 
21)  return  $Q$ 

```

Fig. 2. Overwrite squirrels with its prefix sum.

PARALLEL-BFS($V, \Gamma, \gamma, s, p_{max}$)

$V[0 : n - 1]$ are the n nodes in the graph. $\Gamma[u]$ is the sequence of adjacent nodes to node u . $\gamma[u] = |\Gamma[u]|$. s is the source vertex from which distance is calculated. p_{max} is the maximum number of processors to use. Returns $D[0 : n - 1]$ which represents the distance from s to each vertex.

```

1)  parallel for  $u \leftarrow 0$  to  $n - 1$  do
2)       $D[u] \leftarrow \infty$ 
3)       $OWNER[u] \leftarrow \infty$ 
4)   $D[s] \leftarrow 0$ 
5)   $OWNER[s] \leftarrow 0$ 
6)  if  $\gamma[s] = 0$  then
7)      return  $D$ 
8)   $INPUT \leftarrow \text{array}[0 : 0]$ 
9)   $INPUT[0] \leftarrow s$ 
10)  $LEVEL \leftarrow 0$ 
11)  $p \leftarrow 1$ 
12) while  $|INPUT| \neq 0$  do
13)      $LEVEL \leftarrow LEVEL + 1$ 
14)      $N \leftarrow |INPUT|$ 
15)      $WORK \leftarrow \text{array}[0 : N - 1]$ 
16)     parallel for  $u \leftarrow 0$  to  $N - 1$  do
17)          $WORK[u] \leftarrow \gamma[INPUT[u]]$ 
18)      $GRAIN-SIZE \leftarrow \frac{N}{p}$ 
19)     PARALLEL-PREFIX-SUM(  $WORK, GRAIN-SIZE$  )
20)      $W \leftarrow D[N - 1]$ 
21)      $p \leftarrow \text{MIN}( p_{max}, W )$ 
22)      $SUBLIST \leftarrow \text{FIND-SUBLIST}( WORK, W, p )$ 
23)      $Q \leftarrow \text{LEVEL-TO-QUEUES}( INPUT, WORK, SUBLIST, D, \Gamma, \gamma, W, p, LEVEL )$ 
24)      $SIZES \leftarrow \text{array}[0 : p - 1]$ 
25)     parallel for  $i \leftarrow 0$  to  $p - 1$  do
26)          $Q-NEW \leftarrow \text{queue}$ 
27)         for  $v$  in  $Q[i]$  do
28)             if  $OWNER[v] = i$  then
29)                  $Q-NEW.ENQUEUE( v )$ 
30)          $Q[i] \leftarrow Q-NEW$ 
31)          $SIZES[i] \leftarrow |Q[i]|$ 
32)     PARALLEL-PREFIX-SUM(  $SIZES, 1$  )
33)      $INPUT \leftarrow \text{array}[0 : SIZES[p - 1]]$ 
34)     parallel for  $i \leftarrow 0$  to  $p - 1$  do
35)         if  $i = 0$  then
36)              $OFFSET \leftarrow 0$ 
37)         else
38)              $OFFSET \leftarrow SIZES[i - 1]$ 
39)         for  $j \leftarrow OFFSET$  to  $OFFSET + |Q[i]|$  do
40)              $INPUT[OFFSET] \leftarrow Q[i].DEQUEUE( )$ 

```

Fig. 3. Overwrite squirrels with its prefix sum.