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Summary.

It is widely recognized that a key problem of parallel computation is in the development of both efficient and correct parallel software. Although many advanced language features and compilation techniques have been proposed to alleviate the complexity of parallel programming, much effort is still required to develop parallelism in a formal and systematic way. In this paper, we intend to clarify this point by demonstrating a formal derivation of a correct but efficient homomorphic parallel algorithm for a simple language recognition problem known as bracket matching. To the best of our knowledge, our formal derivation leads to a novel divide-and-conquer parallel algorithm for bracket matching.

Keywords: Skeleton, Parallel Functional Programming, List Homomorphism, Parallelization, Bird-Meertens Formalisms, Program Calculation

1 Introduction

The bracket matching is a kind of language recognition problems, determining whether the brackets in a given string are correctly matched. For example, for the language generated by the grammar

 $S \rightarrow S S$ $S \rightarrow (S)$ $S \rightarrow [S]$ $S \rightarrow \{S\}$ $S \rightarrow \text{ any other symbol}$

the string " $g + \{[o + o] * d\}()$ " is accepted, whereas " $b\{[a)d\}$ " is not. This problem is of interest in parallel programming in that the problem itself is so simple but finding an efficient parallel algorithm is far from being trivial.

It is known [7] that this problem can be solved in $O(\log n)$ parallel time on $O(n/\log n)$ processors in the PRAM model, where n denotes the length of the inputstring. But the algorithms involved are rather complicated. To remedy this

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situation, Cole [6] investigated a methodology for the development of parallel algorithms based upon exploration of parallelism of homomorphisms in Bird Meertens Formalisms [2]. He successfully applied it to derive a homomorphic parallel algorithm for bracket matching. However, there still remain two major problems.

- The derivation proposed by Cole is quite informal, although much effort has been made to show intuitively the correctness of the designed algorithms. As concluded in [6], It is of interest to ask how easily the resulting algorithm might have been derived in a more strictly formal setting.
- The derived homomorphic algorithm is not optimal; it needs the parallel time of $O(\log^2 n)$ rather than the optimal $O(\log n)$ [7]. In a similar approach to Cole's, a homomorphic parsing algorithm [1] is presented for operator precedence grammars, from which a solution to the bracket matching problem can be specialized, but it has linear time behavior in the worst case. It would be more convincing if we could derive an optimal homomorphic algorithm.

This paper shows how these two problems can be well solved based on the parallelization theorem [15]. In particular, we will propose a systematic and formal derivation of, to the best of our knowledge, a *novel* optimal homomorphic algorithm for bracket matching.

2 List Homomorphisms

List homomorphisms, an important concept in Bird Meertens Formalisms (BMF for short) [2], play a central role in our derivation. To make the paper self-contained, we briefly explain some notational conventions of BMF that will be used later.

Function application is denoted by a space and the argument which may be written without brackets. Thus f a means f(a). Functions are curried, and application associates to the left. Thus f a b means (f a) b. Function application binds stronger than any other operator, so $f a \oplus b$ means $(f a) \oplus b$, but not $f(a \oplus b)$. Function composition is denoted by a centralized circle \circ . By definition, we have $(f \circ g) a = f(g a)$. Function composition is an associative operator, and the identity function is denoted by *id*. Infix binary operators will often be denoted by \oplus, \otimes . Lists are finite sequences of values of the same type. We write [] for the empty list, [a] for the singleton list with element a, and x + y for the concatenation of two lists x and y. The term [1] + [2] + [3] denotes a list with three elements, often abbreviated to [1, 2, 3]. We also write a : xs for [a] + xs.

List homomorphisms become more and more attractive in parallel programming [2, 6, 9, 10, 11, 13, 15], mainly because of their distinguished properties of simplicity, clear parallelism, and manipulability.

• First, they are the *simplest* recursive skeletons on join lists; function h is a list homomorphism¹, if there exist a function k and an associative binary operator \oplus so that h is defined by

$$\begin{array}{l} h \ [a] \\ h \ (x + y) = h \ x \oplus h \ y. \end{array}$$

¹ We assume that h is defined over nonempty lists in this paper.

For instance the function sum that sums up all elements of a list is a list homomorphism, in which k = id and $\oplus = +$.

- Second, list homomorphisms attain a potentially high *parallelism*. Intuitively, the value of h on a larger list depends in a particular way (using binary operation \oplus) on the values of h applied to the two pieces of the list, which can be viewed as expressing the well-known divide-and-conquer paradigm in parallel programming.
- Third, list homomorphisms are *manipulable* (suitable for program transformation), because they enjoy many nice algebraic laws, such as the homomorphism lemmas [2, 8], the fusion and tupling transformation laws [13], and the parallelization theorem [15].

3 The Parallelization Theorem

The following gives a parallelization lemma. It is a special case of the general parallelization theorem [15], but is suffice for us to calculate parallel algorithms for bracket matching.

Lemma 1 (Parallelization) Given is a program

where \oplus and \otimes are two associative binary operators. Then, for any non-empty lists x' and x, we have

$$f [a] c = g_0 a c$$

$$f (x' ++ x) c = G_1 x' c \oplus f x (G'_2 x' \otimes c)$$

where G_1 and G_2 are functions defined by

$$\begin{array}{lll} G_1 \ [a] \ c &= g_1 \ a \ c \\ G_1 \ (x'_1 +\!\!\!+ x'_2) \ c &= G_1 \ x'_1 \ c \ \oplus \ G_1 \ x'_2 \ z \ (G_2 \ x'_1 \otimes c) \\ G_2 \ [a] &= g_2 \ a \\ G_2 \ (x'_1 +\!\!\!+ x'_2) &= G'_2 \ x'_2 \otimes G'_2 \ x'_1 \end{array}$$

We will not recap the proof of the lemma as given in [15]. Instead, we demonstrate how it works for calculating parallel algorithms. We consider a simplified bracket matching problem: determining whether a single type (rather than many types) of brackets, '(' and ')', in a given string are correctly matched. This problem has a straightforward linear sequential algorithm, in which the string is examined from left to right. A counter is initialized to 0, and increased or decreased as opening and closing brackets are encountered.

$$sbp' [] c = c == 0$$

$$sbp' (a:x) c = \text{if } a == \text{'(' then } sbp' x (c+1)$$

$$else \text{ if } a == \text{')' then } c > 0 \land sbp' x (c-1)$$

$$else sbp' x c.$$

Unifying three occurrences of the recursive call into a single one using the Normalizing transformation of conditional structures [5] gives

$$sbp'$$
 $(a:x)$ $c = (if a == '(' then True)$
else if $a == ')'$ then $c > 0$ else True)
 \land
 $sbp' x ((if a == '(' then 1)$
else if $a == ')'$ then -1 else $0) + c).$

Now we can apply the lemma by introducing two functions g_1 and g_2 to abstract two subexpressions

$$sbp'(a:x) c = g_1 a c \wedge sbp' x (g_2 a + c)$$

 $g_1 a c = if a == '(' then True)$
 $g_2 a = if a == '(' then 1)$
 $g_2 a = if a == '(' then 1)$
 $g_3 a = if a == '(' then 1)$
 $g_4 = if a == '(' then 1)$
 $g_5 = if a == '(' then 1)$
 $g_5 = if a == '(' then 1)$
 $g_6 = if a ==$

and obtain

$$sbp' (x' ++ x) c = G_1 x' c \land sbp' x (G_2 x' + c)$$

where

This is the parallel version we aim to get in this paper, although it is currently inefficient because of multiple traversals of the same input list by several functions. But this can be automatically improved by the tupling calculation as intensively studied in [14]. For instance, we can obtain the following program by tupling sbp', G_1 and G_2 .

$$sbp' x c = s \text{ where } (s, g_1, g_2) = tup x c tup [a] c = if a == '(' then (c + 1 == 0, True, 1) else if a == ')' then (c - 1 == 0, c > 0, -1) else (c == 0, True, 0) tup (x ++ y) c = let (s_x, g_{1x}, g_{2x}) = tup x c (s_y, g_{1y}, g_{2y}) = tup y (g_{2x} + c) in (g_{1x} \land s_y, g_{1x} \land g_{1y}, g_{2y} + g_{2x})$$

It seems not so apparent that the above gives an efficient parallel program. Particularly, the second recursive call $tup \ y \ (g_{2x} + c)$ relies on g_{2x} , an output from the first recursive call $tup \ x \ c$. Nevertheless, this version of tup can be efficiently implemented in parallel on a multiple processor system supporting bidirectional tree-like communication with $O(\log n)$ complexity where n denotes the length of the input list, by using an algorithm similar to that in [4]. Two passes are employed; an upward pass in the computation is used to compute the third component of $tup \ x \ c$ before a downward pass is used to compute the first two values of the tuple. To summarize the above, we can get the following performance lemma.

Lemma 2 (Performance) In Lemma 1, the parallelized f can be implemented using $O(max(t_{g_0}, t_{g_1}, t_{g_2}) + max(t_{\oplus}, t_{\otimes}) \times \log n)$ parallel time on $(n/\log n)$ processors in the PRAM model, where n denotes the length of the input list, and the notation t_{op} denotes the time for computing op.

4 Derivation

We return to our main topic; deriving an efficient homomorphic parallel algorithm for bracket matching (of many types of brackets). We start with a naive sequential program, and then try to parallelize it using the parallelization lemma. The key to our derivation is a new idea for constructing an efficient associative operator to combine two stacks.

4.1 Specification

Compared to the bracket matching of a single type of brackets, arbitrary bracket types complicates the bracket matching problem. But a simple straightforward linear time sequential algorithms still exists by using a stack. Opening brackets are pushed, and a closing brackets are matched with the current stack top. Failure is indicated by a mismatch, or by a nonempty stack when a match is required or at the end of the scan of the input. Thus we come to the following straightforward specification.

$$bm [] s = isEmpty s$$

$$bm (a : x) s = if isOpen a then bm x (push a s)$$

$$elseif isClose a then noEmpty s \land match a (top s) \land$$

$$bm x (pop s)$$

$$else bm x s$$

Here we use several boolean functions; *isOpen* and *isClose* are to determine if a symbol is an opening or an closing bracket, *match* to determine if two symbols are bracket-matched, e.g., *match* '[']' gives *True* whereas *match* '(']' gives *Flase*, and *isEmpty* and *noEmpty* to determine if a stack is empty or not.

4.2 Linearization

We intend to use the parallelization lemma to derive a parallel algorithm from the specification. Comparing the specification with the program that can be accepted by the parallelization lemma indicates that three occurrences of the recursive call should be unified into a single one, and that we a definition of bm for the case of a singleton list should be given. The formal can be done in a similar way as for sbp', and the latter can be done by a simple in-lining.

$$bm [a] s = g_0 a s$$

 $bm (a:x) s = g_1 a s \land bm x (g_2 a s)$

where

$$g_0 \ a \ s = ext{if } isOpen \ a ext{ then } False$$

else if $isClose \ a ext{ then } match \ a \ (top \ s) \ \land \ isEmpty \ (pop \ s)$
else $isEmpty \ s$
 $g_1 \ a \ s = ext{if } isOpen \ a ext{ then } True$
else if $isClose \ a ext{ then } noEmpty \ s \ \land \ match \ a \ (top \ s)$
else $True$
 $g_2 \ a \ s = ext{if } isOpen \ a ext{ then } push \ a \ s$
else if $isClose \ a ext{ then } push \ a \ s$
else if $isClose \ a ext{ then } push \ a \ s$
else if $isClose \ a ext{ then } push \ a \ s$
else if $isClose \ a ext{ then } push \ s$

4.3 Deriving an associative operator

Now the function bm is in an accepted form that the parallelization lemma can be applied, provided that there exists an associative operator \otimes such that g_2 can be expressed by

$$g_2 \ a \ s = g'_2 \ a \ \otimes \ s.$$

Fortunately, we know that an associative operator can be systematically derived from many algebraic data types [16, 15]. Let the stack be defined by 2

$$Stack = Empty | Push Char Stack | Pop Stack$$

from which we know that an associative operator \otimes (also called *zero-replacement* function which inductively replaces zero-constructor *Empty* by another stack) can be derived using the standard technique [16, 15].

$$Empty \otimes s = s$$

$$(Push \ a \ s') \otimes s = Push \ a \ (s' \otimes s)$$

$$(Pop \ s') \otimes s = Pop \ (s' \otimes s)$$

It is left for reader to check that \otimes is indeed associative and has *Empty* as its identity unit. Consequently, we can extract s out of g_2 using \otimes and obtain

$$g_2 \ a \ s = g'_2 \ a \otimes \ s$$
$$g'_2 \ a = \text{if } is Open \ a \ \text{then } push \ a \ Empty$$
$$else if \ is Close \ a \ \text{then } pop \ Empty$$
$$else \ Empty$$

From the stack property $Pop \circ Push \ a = id$, we can see that our stack can be kept in the following normal form

$$Push \ a_1 \ (Push \ a_2 \ (\cdots (Push \ a_n \ (Pop \ (Pop(\cdots (Pop \ Empty)))))))$$
(1)

that is, the occurrences of the Pop constructor, if there are, should appear inside the Push constructors, but not vice visa. With this normal form, we give definitions

 $^{^2}$ Notice that we include *Pop* as a data constructor that is usually considered as a destructor of the stack. By doing so, we can postpone constructing stack.

for those functions that manipulate the stack.

push a s	=	$Push \ a \ s$
$pop \ s$	=	$Pop \ s$
$top \ (Push \ a \ s)$	=	a
isEmpty Empty	=	True
$isEmpty$ _	=	Flase
noEmpty	=	$not \circ is Empty$

4.4 Efficiently Implementing \otimes

Applying the parallelization lemma will soon give our homomorphic algorithm. But according to the performance lemma we expect that \otimes to be implemented in constant parallel time, in order to obtain an $O(\log n)$ parallel algorithm. As a matter of fact, the present definition is unsatisfactory; it is sequential. We shall show how to implement \otimes efficiently in parallel.

Recall that our stack has the form of (1), which can be represented by a list of a_1, \dots, a_n and the number of the *Pop* constructor, i.e.,

$$([a_1,\cdots,a_n],n,m)$$

where m denotes the number of Pop's. Note that to simplify our later presentation, we include the second element n so that the length of the first component can be computed incrementally. With this representation, we can implement the stack constructors as follows.

$$Empty = ([], 0, 0)$$

$$Push \ c \ (cs, n, m) = ([c] + cs, n + 1, m)$$

$$Pop \ (c : cs, n + 1, m) = (cs, n, m)$$

$$Pop \ ([], 0, m) = ([], 0, m + 1)$$

And

$$(cs_1, n_1, m_1) \otimes (cs_2, n_2, m_2) = \text{if } m_1 \ge n_1 \text{ then } (cs_1, n_1, m_1 - n_2 + m_2) \text{else } (cs_1 + drop \ (n_2 - m_1) \ cs_2, n_1 + n_2 - m_1, m_2)$$

where drop n xs drops off the first n elements, Because drop and + can be implemented in parallel using constant time, it follows that \otimes can be implemented in constant parallel time.

4.5 Applying the parallelization lemma

- -

Now we are ready to apply the parallelization lemma, and obtain the following parallel algorithm for bracket matching.

$$bm [a] s = g_0 a s$$

$$bm (x' ++x) s = G_1 x' s \wedge bm x (G'_2 x' \otimes s)$$

$$G_1 [a] s = g_1 a s$$

$$G_1 (x_1 ++x_2) s = G_1 x_1 s \wedge G_1 x_2 (G'_2 x_1 \otimes s)$$

$$G'_2 [a] = g'_2 a$$

$$G'_2 (x_1 ++x_2) = G_2 x_2 \otimes G_2 x_1$$

```
bracketMatching :: String \rightarrow Bool
bracketMatching x = tup x Empty
tup [a] s
                      = if isOpen a then (False, True, push a Empty)
                          elseif isClose a then (match a (top s) \land isEmpty (pop s)
                                                   noEmpty \ s \ \land \ match \ a \ (top \ s),
                                                   pop \ Empty)
                         else (isEmpty \ s, True, Empty)
tup (x ++ y) s
                      = let (bm_x, g_{1x}, g'_{2x}) = tup \ x \ c
                             (bm_y, g_{1y}, g'_{2y}) = tup \ y \ (g'_{2x} \otimes s)
                         in (g_{1x} \wedge bm_y, g_{1x} \wedge g_{1y}, g'_{2y} \otimes g'_{2x})
where
         Empty
                                 = ([], 0, 0)
         push a(x, n, m)
                                 = ([a] + x, n + 1, m)
         pop (a: x, n+1, m) = (x, n, m)
         pop ([], 0, m)
                                = ([], 0, m+1)
                                 = if s == ([], 0, 0) then True else False
         isEmpty \ s
         noEmpty \ s
                                 = not(isEmpty s)
and
              (x_1, n_1, m_1) \otimes (x_2, n_2, m_2)
                = if m_1 \ge n_1 then (x_1, n_1, m_1 - n_2 + m_2)
                  else (x_1 + drop (n_2 - m_1) x_2, n_1 + n_2 - m_1, m_2)
```

Fig. 1 The Final Program for Bracket Matching

It is not difficult to check that $g_0, g_1, g'_2, \wedge, \otimes$ can be implemented using constant parallel time. It soon follows from the performance lemma that the final program is a $O(\log n)$ parallel program. To be more explicit, we summarize our final algorithm in Figure 1, by applying the tupling transformation, and substituting all functions with their final definitions.

In fact, as discussed in [12], this program can be automatically translated into an efficient NESL code [3], which can run on various of parallel architectures in practice. The NESL code is given in the appendix.

5 Conclusion

In this paper, we show, by a case study, that the parallelization lemma is very useful for formal derivation of parallel algorithms, besides its effectness in constructing parallelization compiler as studied in [12]. In particular, we formally derive a novel but efficient parallel homomorphic algorithm for bracket matching, which would be difficult with other approaches [10, 11].

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A Our Parallel Program for Barcket Matching in NESL

The following gives our NESL code for Bracket Matching. It is an $O(\log n)$ parallel program according to the performance model of NESL.

```
% ======= Stack Datatype =========================%
datatype Stack ([Char], Int);
function isEmpty (s) : Stack -> Bool =
  let
   Stack (pu, po) = s
  (#pu == 0 and po == 0);
function noEmpty (s) : Stack -> Bool =
  not (isEmpty (s));
function push (c, s) : (Char, Stack) -> Stack =
  let
    Stack (pu, po) = s
  in
  Stack ([c] ++ pu ,po);
function pop (s) : Stack -> Stack =
  let
    Stack (pu, po) = s
  in
if #pu == 0
  then
    Stack (pu, po + 1)
  else
    Stack (drop (pu, 1), po);
function top (s) : Stack -> Char =
  let
Stack (pu, po) = s
  pu [0];
empty = Stack (dist ('x, 0), 0);
function otimes (x, y) : (Stack, Stack) -> Stack =
  let
    Stack (xpu, xpo) = x;
    Stack (ypu, ypo) = y
  in
  if xpo >= #ypu
  then
    Stack (xpu, xpo + ypo - #ypu)
  else
    Stack (xpu ++ drop (ypu, xpo), ypo);
% ======== Main Algorithm ========%
function otimes_rev (x, y) : (Stack, Stack) -> Stack =
  otimes (y, x);
function isOpen (c) : Char -> Bool =
  (c == '(or c == '[or c == '{});
function isClose (c) : Char -> Bool =
  (c == ') or c == '] or c == '};
function match (c1, c2) : (Char, Char) -> Bool =
   (c1 == '( and c2 == ')) or (c1 == '[ and c2 == ']) or (c1 == '{ and c2 == '});
function bm (x, st) : ([Char], Stack) -> Bool =
  let
    g20 = {if isOpen (a)
            then
              push (a, empty)
```

```
else if isClose (a)
            pop (empty)
else
              empty
  cmpty
: a in x};
(g21, e) = scan (otimes_rev, empty, g20);
s0 = {otimes (g21e, st) : g21e in g21};
b0 = {if isOpen (a)
then
             then
              F
             else if isClose (a)
            (if noEmpty (s) then (match (top (s), a) and isEmpty (pop (s))) else F) else_____
              isEmpty (s)
  : s in s0; a in x};
g10 = {if isOpen (a)
            then
T
            else if isClose (a)
            then
                (if noEmpty (s) then match (top (s), a) else F)
             else
  T
: s in s0; a in x};
g11 = and_scan (g10);
b1 = {g11e and b0e : g11e in g11; b0e in b0}
in
b1[#b1 - 1];
```

function bracketMatching (str) : [Char] -> Bool = bm (str, empty);