# **UWOmp**<sub>pro</sub>: **UWOmp**++ with Point-to-Point Synchronization, Reduction and Schedules

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### **Abstract**

An OpenMP program internally creates a team of threads, which share a given set of *activities* (for example, iterations of a parallel-for-loop). OpenMP allows synchronization among these threads. However, many classes of computations can be conveniently expressed by using synchronization among the parallel activities. Currently, OpenMP restricts any form of synchronization among the parallel activities; otherwise, the behavior of the program can be unpredictable. While extensions like UWOmp++ (and its precursor UW-OpenMP) support all-to-all barriers among the activities, currently there is no support for efficiently performing point-to-point synchronization among them. In this paper, we present UWOmp $_{pro}$  as an extension to UWOmp++ (and OpenMP) to address these challenges to realize more expressive and efficient codes.

UWOmp $_{pro}$  allows point-to-point synchronizations among the activities of a parallel-for-loop and supports reduction operations. We present a translation scheme to compile UWOmp $_{pro}$  code to efficient OpenMP code, such that the translated code does not invoke any synchronization operations within parallel-for-loops. Our translation takes advantage of continuation-passing-style (CPS) to efficiently realize wait and continue operations. We also present a runtime, based on a novel communication subsystem to support efficient signal and wait operations, along with reduction operations and arbitrary schedules of OpenMP. We have implemented our scheme in the IMOP compiler framework and performed a thorough evaluation. We show that our approach leads to highly performant codes.

#### 1 Introduction

OpenMP is a widely used parallel-programming API, where a programmer can insert compiler directives and utilize runtime routines to enable parallelism in sequential code. OpenMP uses the efficient 'team of workers' model, where

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```
t = 0;
t = 0;
#pragma omp parallel
                             #pragma omp parallel
 #pragma omp for
                               #pragma omp for
 for(i=1;i<N-1;i++){}
                               for(i=1; i< N-1; i++){
  while(t \le T) {
                               while(t \leq T) {
                                B[i]=0.3*(A[i-1]+
    B[i]=0.3*(A[i-1]+
              A[i]+A[i+1]);
                                           A[i]+A[i+1]);
   #pragma omp barrier
                                 signal(i!=1,1);
                                 waitAll(i==1);
   if (i==1)
                                 if (i==1)
     \{x=A; A=B; B=x; t++;\}
                                   \{x=A; A=B; B=x; t++;\}
   #pragma omp barrier
                                 signalAll(i==1);
                                 wait(i!=1,1);
  } } }
    (a) UW-OpenMP Version
                                  (b) UWOmp_{pro} Version
```

**Figure 1.** 1D Jacobian computation. Here A and B are shared arrays of N elements and T indicates the number of timesteps.

each worker (also interchangeably referred to as thread) is given a chunk of activities to execute. An important facet of this model is that workers (and not activities) synchronize among themselves using barriers. However, certain computations (for example, stencil computations, graph analytics, and so on) are specified, arguably more conveniently, by expressing the synchronization among different dependent activities. Further, in contrast to global barriers (that perform all-to-all synchronization) among the parallel activities of a program, it may be more expressive and efficient to synchronize only the inter-dependent activities. We refer to the latter as the point-to-point mode of synchronization.

We first use a motivating example to illustrate the expressiveness due to point-to-point synchronization and the scope of improved performance therein. Figure 1a shows the classical 1D Jacobian kernel (source [2]) written in UWOmp++ [3]. Note that OpenMP does not allow barriers inside worksharing constructs (like parallel-for-loops), as the behavior of such programs can be unpredictable (may lead to incorrect output, correct output, or deadlock) [1]. UWOmp++ supports the unique worker model in OpenMP, in which the programmer gets an impression that each iteration (a.k.a. activity) of the parallel-for-loop is run by a unique worker and thus the model allows all-to-all barriers to be specified among the activities. Aloor and Nandivada [3] have shown that such UWOmp++ versions are efficient and arguably more expressive compared to the OpenMP version. However, such codes still suffer from multiple drawbacks.

In the code shown in Figure 1a, each activity  $X_i$  (corresponding to iteration i) is waiting for all the remaining

activities instead of only the  $X_1$  waiting for all the other activities (to complete their computation), before swapping the pointers. Similarly, each activity waits for every other activity at the second barrier, even though each activity  $X_i$  ( $i \neq 1$ ) needs to wait only for activity  $X_1$ . This leads to significant communication overheads.

To address such issues of communication overheads and improve the expressiveness, there have been many prior efforts to support point-to-point synchronization in task parallel languages like X10 [11], HJ [9], and so on, using explicit synchronization objects (like Clocks [11] and Phasers [9]). In the context of OpenMP, Shirako et al. [28] present a promising approach to adapt HJ phasers to OpenMP. They allow activities to explicitly register/deregister themselves with phaser objects and these phaser objects are used to perform the synchronization among the registered activities. However, their design has multiple restrictions (i) the synchronization can only be in one direction, that is, from left to right - can be limiting in terms of expressiveness; (ii) threads (not activities) block on wait operations – can limit parallelism and impact performance negatively; (iii) their scheme cannot work with dynamic/guided scheduling of OpenMP; and (iv) the activities cannot perform reduction operations at the synchronization points.

In this paper, we address all these issues and propose a generic scheme to allow synchronization among the activities of each parallel-for-loop of OpenMP. We call our extension UWOmp $_{pro}$ .

Figure 1b shows a UWOmp $_{pro}$  version of the kernel shown in Figure 1a. Here, the first all-to-all barrier of Figure 1a has been replaced with two commands, where all activities (except the first activity) signal  $X_1$ , and  $X_1$  in turn waits for the signals from them. A convenient feature of UWOmp $_{pro}$  is that it supports conditional signal/wait commands. The first argument passed to the corresponding commands, evaluates to 1 (true) or 0 (false), determines if the command should be executed by that activity or not. Further, the signal (wait) commands can signal to (wait for) multiple activities that are specified by a comma separated list of iterations. Example: signal(1, i-1, i+1) sends a signal to  $X_{i-1}$  and  $X_{i+1}$ .

The second all-to-all barrier of Figure 1a has been replaced with two commands: signalAll, followed by wait. The given condition in the signalAll command ensures that signalling is done only by  $X_1$  to all the remaining activities. These activities ( $X_1$ ,  $1 \neq 1$ ) in turn wait for that signal.

In contrast to X10 and HJ, in UWOmp $_{pro}$  activities of a parallel-for-loop can synchronize between themselves without any need for the programmer to explicitly create (or pay the overheads of) synchronization objects. In addition, UWOmp $_{pro}$  optionally supports efficient reduction operations at the synchronization (wait) points. Further, our design ensures that we continue to take advantage of the efficient

'team of workers' model of OpenMP to derive high performance.

UWOmp $_{pro}$  can help effectively and efficiently code wide classes of problems involving point-to-point synchronizations and reductions. Note: We do not claim that using point-to-point synchronization among the activities of parallel-for-loops is the only/best way to encode such computations. Instead, our proposed extension (common in modern languages like X10, HJ, and so on) provides additional ways to encode task parallelism, which is otherwise missing in OpenMP (and UWOmp++), while not missing out on the advantage of the efficient 'team of workers' model of OpenMP.

#### **Our Contributions**

- We propose  $\mathrm{UWOmp}_{pro}$  to allow point-to-point synchronizations and reduction operations, between the activities of parallel-for-loop. In contrast to  $\mathrm{UWOmp}_{++}$ ,  $\mathrm{UWOmp}_{pro}$  supports all the scheduling policies defined in OpenMP.
- $\bullet$  We present a translation scheme to compile UWOmp $_{pro}$  code to efficient OpenMP code by using an IR that takes advantage of continuation-passing-style (CPS) to efficiently realize wait and continue operations.
- We present a runtime based on a novel communication subsystem using postboxes, to support efficient signal and wait functions, along with reduction operations and arbitrary schedules of OpenMP. To support fast reduction operations, we propose two reduction algorithms termed *eager* and *lazy*, which support efficient reduction operations among a subset of activities and all activities, respectively.
- We have implemented our scheme in the IMOP compiler framework and performed a thorough evaluation. We show that our generated code scales well and is highly performant.

### 2 Background

We now present some brief background needed for this paper. **OpenMP.** We now briefly describe some OpenMP constructs; interested readers may see the OpenMP manual [13].

**Parallel Region**: #pragma omp parallel S creates a team of threads where each thread executes S in parallel.

**Parallel-For-Loop**: A sequential for-loop can be annotated using #pragma omp for nowait schedOpt to distribute the iterations among the team of threads. The scheduling policy (static (default), dynamic, guided, or runtime) is mentioned using schedOpt. In the absence of the nowait clause, an implicit barrier is assumed after the for-loop.

**Barrier**: #pragma omp barrier construct is used to synchronize the workers in the team.

Unique Worker Model for OpenMP. We now restate two relevant definitions given by Aloor and Nandivada [3].

**Definition 2.1.** An OpenMP parallel-for-loop is said to be executing in UW model if a unique worker executes each iteration therein.

**Definition 2.2.** An OpenMP parallel-for-loop is said to be executing in (One-to-Many model) or OM-OpenMP model

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commands	target activities	reduction?
signal, wait	1 or more	×
signalAll, waitAll	all	×
signalSend, waitRed	1 or more	✓
signalAllSend waitAllRed	all	<b>√</b>

Figure 2. List of commands supported by UWOmp<sub>pro</sub>.

if a worker may execute one or more iterations of a parallelfor-loop. OM-OpenMP model is the default execution model in OpenMP. A program executing in OM-OpenMP model cannot invoke barriers (or wait commands) inside worksharing constructs.

# 3 UWOmp<sub>bro</sub>: Extending UWOmp++

We now describe three new extensions to UWOmp++ that can improve the expressiveness and lead to efficient code. Two of these extensions (support for point-to-point synchronization among the activities, and performing reduction among the synchronizing activities) are novel to OpenMP as well. The third extension admits powerful scheduling policies (dynamic, guided, and runtime) of OpenMP, apart from the *static* scheduling policy that was already supported by UWOmp++. We call this extended language UWOmp<sub>pro</sub>.

# 3.1 Point-to-Point Synchronization

UWOmp<sub>pro</sub> proposes an extension to UW-OpenMP, where a programmer can specify point-to-point synchronization among the activities of a parallel for-loop. Figure 2 summarizes the list of commands supported by UWOmp<sub>pro</sub>, for easy reference. All these commands are conditional in nature and support (i) signal and wait operations to a subset of activities or all of them, and (ii) (optionally) reduction operations. As discussed in Section 1, Figure 1b shows the UWOmp<sub>pro</sub> code (using point-to-point synchronization) to perform the Jacobian 1D stencil computation shown in Figure 1a. Note: a signal/wait command to/on a non-existing iteration is treated as *nops*. That way, the programmers can simply write code of the form #ompfor for (i=0; i< n; ++i){signal (i+1); wait (i-1);} without having to worry about the boundary cases.

# 3.2 Reduction

Consider the example code snippet shown in Fig. 3a (Source [2, 10]) to perform iterated averaging on an N element array, written in UWOmp++. Here, each activity  $X_i$ first computes a new value for the  $i^{th}$  element using A[i-1] and A[i+1] and then computes the absolute difference compared to the older value. Towards the end of each iteration of the while-loop, each activity waits for  $X_1$  to sequentially reduce the array diff to the shared variable d, which is used for checking the convergence condition specified in the while-loop predicate. The sequential reduction operation can pose serious performance overheads. Note that, we cannot use the OpenMP reduction operation to perform the reduction here, as the reduced value would only be available after the end of the parallel for-loop. To address these

```
#pragma omp parallel
#pragma omp parallel
 #pragma omp for
                              #pragma omp for
 for(i=1;i<N;i++) {
                              for(i=1; i<N; i++){}
  while(d <= epsilon) {</pre>
                               while(d <= epsilon) {</pre>
  B[i]=(A[i-1]+A[i+1])*0.5;
                               B[i]=(A[i-1]+A[i+1])*0.5;
  diff[i] = abs(A[i]-B[i]);
                                diff[i] = abs(A[i]-B[i]);
   #pragma omp barrier
                                signalAllSend(1,diff[i]);
   if(i==1){
                                waitAllRed(1,d,ADD);
    d=computeSum(diff,N);
                                if(i==1){x=A; A=B; B=x;}
    x=A; A=B; B=x; 
                                signalAll(i==1);
   #pragma omp barrier
                                wait(i!=1,1);
   } /*while*/ } /*for*/ }
                               } /*while*/ } /*for*/ }
    (a) UW-OpenMP Version
                                 (b) UWOmppro Version
```

Figure 3. Iterated Averaging. Here A and B are shared arrays of N elements and epsilon specifies the tolerance limit.

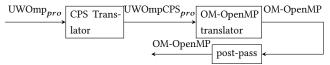


Figure 4. Block diagram of our proposed translation scheme.

issues, UWOmp<sub>pro</sub> supports a blocking reduction operation within the activities of a parallel for-loop. For example, In the code snippet Fig. 3b, after computing diff[i], each activity  $X_i$  sends a signal to all the other activities with its value of diff[i]. Then, the code invokes a blocking reduction operation, specifying the variable (d) to hold the reduced value, and the reduction operation (ADD). In contrast to the UW-OpenMP version, in the UWOmp<sub>pro</sub> version, all threads together perform the reduction operation in parallel. Note that in contrast to OpenMP, for ease of readability, we use verbose reduction operator names (for example, ADD in place of '+').

#### 3.3 Schedules

Due to its design decisions, UW-OpenMP supports only static scheduling. Considering the importance of other scheduling policies of OpenMP, UWOmp<sub>pro</sub> supports all of them by using a runtime extension. Details in Section 5.5.

# 4 UWOmp<sub>pro</sub> to Efficient OM-OpenMP

We now present the translation rules that we use to convert a given input  $UWOmp_{pro}$  code to efficient OM-OpenMP code. The main idea behind our translation is that in the generated OM-OpenMP code, the iterations of the for-loop (or the activities) are stored as closure (in one or more work-queues) to be executed by different workers. When an activity encounters a wait operation, it enqueues the continuation to the work-queue of the parent activity and continues executing other activities in the work-queue. Figure 4 shows the block diagram of our translation. We now describe the different important modules of our translation scheme.

### 4.1 CPS Translator

Our translation scheme is inspired by that of Aloor and Nandivada [3], who translate an input program to an IR

```
::= (CPSFuncDecl)* (FuncDecl)* MainFunc
Program
CPSFuncDecl
                ::= void ID(Closure K,Args){
                   (SimpleStmt)* TailCallStmt}
MainFunc
                ::= int main() { CPSParRegion }
CPSParRegion
                ::= #pragma omp parallel
                  { (CPSParForLoop | BarrierStmt)* }
CPSParForLoop ::= #pragma omp for nowait schedOpts
                   for(ID=0;ID<ID;ID++)
                   (SimpleStmt)* CPSFunCall }
TailCallStmt
                ::= CPSFunCall | CPSIfStmt
SimpleStmt
                ::= AssignStmt | IfStmt
CPSFunCall
                ::= ID(ID,ActualParamList);
BarrierStmt
                ::= #pragma omp barrier
                ::= if(SimpExpr){(AssignStmt)*CPSFunCall}
CPSIfStmt
                ::= if(SimpExpr){ (SimpleStmt)* }
IfStmt
                ::= ID <BinOp> ID | <UnaryOp> ID
SimpExpr
```

Figure 5. Grammar for UWOmpCPS<sub>pro</sub>

(called UWOmpCPS), before lowering it to OM-OpenMP. UWOmpCPS is an extension to CPS (Continuation Passing Style [19]); its choice was inspired by the fact that CPS naturally provides support for operations like wait and continue. A UWOmpCPS program is similar to a program in CPS form, except that the former may include parallel-for-loops and barriers. One of the sources of overheads of the scheme of Aloor and Nandivada was that all the methods were converted to CPS form. We observe that since only the activities of parallel-for-loops can synchronize with each other (point-to-point or all-to-all), we need to CPS transform only those functions that may be invoked by the iterations of the parallel-for-loop. Further, in the input UWOmp<sub>pro</sub> program, thread-level barriers (invoked via #pragma omp barrier), may appear outside the work-sharing constructs.

Based on these observations, we first provide a modified version of the UWOmpCPS grammar and then discuss the changes to the translation rules of Aloor and Nandivada.

**4.1.1 UWOmpCPS**<sub>pro</sub>: **Modified CPS IR.**We only CPS-transform the body of the parallel-for-loops (unlike UWOmpCPS). Thus, not all functions need to be in CPS form and incur the penalties thereof.

We use a modified IR called UWOmpCPS  $_{pro}$ ; grammar shown in Figure 5. Some of the main differences between UWOmpCPS and UWOmpCPS  $_{pro}$  are as follows: (i) A program may consist of both CPS and non-CPS functions. (ii) A CPSParRegion may only contain set of parallel-for-loops in CPS form (CPSParForLoop) or barriers. (iii) A CPSParForLoop can specify a schedule and related options (represented as schedOpt). (iv) As is standard in CPS translation, the continuation object is passed as an additional argument to each CPS function call (CPSFunCall). Note that Stmt denotes any sequential statement, FuncDecl is any regular C function declaration, FunCall is any regular non-CPS function call statement; we skip the expansion of these non-terminals for brevity.

Figure 6. CPS translation rules for the parallel constructs.

**4.1.2 Generation of code in CPS form.** The rules of our CPS-translator which translates the input UWOmp $_{pro}$  programs to UWOmpCPS $_{pro}$ , are similar to that of Aloor and Nandivada [3], except for the rules shown in Figure 6. Here, a rule of the form  $[\![X]\!] \Rightarrow Y$  is used to denote that input code X is transformed to the output code Y in UWOmpCPS $_{pro}$ . The right-hand side (Y) may contain further terms with  $[\![\ ]\!]$  indicating that those terms need to be further transformed. In the rules, we use #ompparallel as a shortcut for #pragma omp parallel, and #ompfor as a shortcut for #pragma omp for nowait schedOpt. Our CPS transformation starts by transforming the parallel-region (Rule 1).

Without any loss of generality and for the ease of translation, the rule to translate a parallel-for-loop (Rule 2) assumes that the body of the loop is a single function call. This can be easily obtained by applying a simplification step, like the ones used by Aloor and Nandivada [3]. Rule 2 has two substeps: (i) the function that is called in the body of the parallel-for-loop (fun) is translated to CPS form (using the standard CPS transformation rules, discussed by Aloor and Nandivada [3, Rules 2-10, Figure 4]), by passing the identify function id as the continuation. Here, mkClsr is a macro that creates a closure by taking three arguments: a function pointer, the list of arguments required for the function (obtained by invoking a compiler-internal routine bEnv), and a continuation to be executed after executing the function. (ii) The call to fun is replaced by a call to its CPS counterpart which passes the continuation as an additional argument.

During the translation of a parallel region, if any statement is encountered which contains no parallel-for-loops, we emit the statement as it is (Rule 3).

# 4.2 OM-OpenMP Translator

We now discuss how we translate code in UWOmpCPS  $_{pro}$  format to OM-OpenMP code. The goal of the translation is to ensure that each iteration of the parallel-for-loop, creates a closure object and enqueues to a work-queue. The details of the work-queue depend on the scheduling policy of the parallel-for-loop. For static scheduling policy, the activities to be executed by each thread is fixed a priori and thus we maintain a local worklist for each thread. For guided or dynamic scheduling policy, all the closures are pushed to a global 'work queue'. Each thread takes some number of

```
tid=thread-number();
                       sched=getSchedule(schedOpt);
                      chSize=getChunkSize(schedOpt);
                       if(sched is static){
                        scheduler=&scheduler-static;
                        WL[tid] = \text{new } WL(); //\text{local } Q
                       }else if(sched is dynamic){
#ompfor
                        scheduler=&scheduler-dynamic;
for(Header){
                        WL[tid] = globalWL; // global Q
K=mkClsr(X); \Rightarrow
                       }else{ // guided
fCPS(K, args);
                   11
                        scheduler=&scheduler-guided;
                        WL[tid]=globalWL;/*global Q*/}
                   12
                   13
                      for(Header) {
                   14
                         K=mkClsr(X);
                   15
                         C=mkClsr(fCPS,bEnv(args),K);
                   16
                         enqueue (WL[tid], C); }
                       (*scheduler)(chSize);
```

**Figure 7.** UWOmpCPS  $_{pro}$  to OM-OpenMP Translation.

closures from the queue and executes the same. Figure 7 shows the rule to translate the parallel-for-loop.

We first emit code to identify the specified schedule (returned by getSchedule, which in turn derives it from the schedOpt string). Accordingly, we store the function pointer of the corresponding scheduler function (defined in Section 5.5) and remember the worklist to be used by each thread (WL[tid]). We emit a parallel-for-loop that pushes the closure for each activity to WL[tid] (Lines 13-17). Finally, we invoke the appropriate scheduler (Line 18).

Note: if schedOpt is not set, then getSchedule sets the schedule to static. Similarly, if schedOpt is set to *runtime*, then getSchedule will obtain the schedule from the language-specified environment variable.

#### 4.3 Post-Pass: Type Specific Reduction Operations

The final step in our translation process is to introduce type specific reduction operations for the reduction operations specified in the OpenMP specification [13]. As mentioned in Section 3.2, the reduction-related wait commands in the input UWOmp $_{pro}$  code take a reduction operation and a reduction variable rVar (which stores the reduced result), as additional arguments to the wait command. The compiler uses the declared type of rVar (say, int) to replace the user specified reduction operation (say, ADD representing the "+") with the actual reduction function (say, ADDint) in the wait commands. For each of the primitive types T, our runtime provides functions for performing the reduction (for example, ADDint, ADDdouble, and so on).

In addition to introducing the type-specific reduction operation, the reduction procedure needs a method to copy values from one variable to the other (for example, to copy the final computed value to the reduction variable). Similar to the type-specific reduction operations, for each of the primitive types T, our runtime provides functions for performing the copy operation (for example, 'COPYint (int \*from,

int \*to)') and the corresponding function is passed as an additional argument to the wait method calls. For example, the command waitAllRedCPS (K, i==1, ADD, x), where x is the reduction variable of type int, gets replaced by wait-AllRedCPS (K, i==1, ADDint, x, COPYint).

#### 4.4 Example translation

For a better understanding of our translation scheme, in Figure 8, we describe the steps in transforming a sample UWOmp<sub>pro</sub> code to OM-OpenMP code. We now discuss the salient features in our translation. Figure 8a shows the input UWOmp<sub>pro</sub> code and Figure 8b shows the CPS transformed version. The standard set of CPS transformation rules are applied to the function f to convert it to fCPS, and generate other CPS functions (pCPS1, pCPS2 and pCPS3). We avoid showing the second argument to mkClsr as it depends on the actual statements following the call (for example, S2 and S3). The parallel-for-loop body creates an identity closure K to denote the continuation after the execution of the parallel-for-loop. It calls fCPS with closure K as an argument.

Figure 8c shows the OM-OpenMP translated code of the UWOmpCPS  $_{pro}$  code. This step emits code to identify the appropriate scheduler (Lines 1-12 from Figure 7) and wraps the call to function fCPS inside the closure C before enqueuing the closure in the appropriate worklist WL[tid]. Finally, Figure 8d shows the OpenMP translated code with the postpass translation rules applied on the waitRedCPS method.

# Runtime Support

We now describe the extensions to the OpenMP runtime that we made to support the key operations supported by the language extensions defined in  $UWOmp_{pro}$ : signalling, waiting, performing reduction and supporting arbitrary schedules of OpenMP. Our support for these operations is based on our novel design of the communication sub-system between the activities of a parallel-for-loop. We will first describe that and then follow it up with a discussion on the runtime support required for implementing the key operations.

# 5.1 Shared Postbox System for Communication

We present a postbox based system for communication among the activities of a parallel-for-loop. We discuss the design of three types of postboxes: *signal-only*, *data-messages-only*, or mixed signals and data-messages (*mixed-mode*).

**5.1.1 Design of the Postbox.** Each activity  $X_i$  of a parallel-for-loop, may receive one or more signals/data-messages from other activities. To avoid contention among the communicating activities, we associate a postbox with each activity  $X_i$ . Thus, the postbox P is an array of N elements (where N is the total number of activities), such that each element  $P_i$  represents the postbox of  $X_i$ .

We observed that for most of the parallel-for-loops using point-to-point synchronization, the number of activities that an activity communicates with, in a phase, is small. Based upon this observation, for such loops we set each postbox  $P_i$  to be a hashmap (of initial-size set to a constant k, with

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```
void f(args){
                                       int main(){
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       S1; signalSend(1,m,i+1);
                                       #ompparallel
552
        S2; waitRed(1,ADD,x,i-1);
553
                                       tid=thread-number();
554
       int main(){
                                       sched=getSchedule(schedOpt);
      #ompparallel
555
                                       chSize=getChunkSize(schedOpt);
                                       if(sched is static){
556
         #ompfor
                                        scheduler=&scheduler-static;
557
          for(Header){
                                        WL[tid]=\text{new }WL();
558
            f(args); } } }
                                       }else if(sched is dynamic){
559
                                        scheduler=&scheduler-dynamic;
          (a) Input UWOmp_{pro} code.
                                        WL[tid]=globalWL;
560
      void fCPS(K,args){
                                       }else{ // guided
561
                                        scheduler=&scheduler-guided;
562
       C1=mkClsr(pCPS1,...,K);
                                        WL[tid]=globalWL; }
563
        signalSendCPS(C1,1,m,i+1);}
                                        #ompfor
      void pCPS1(K){
564
                                         for(Header){
                                          K=mkClsr(id,null,null);
565
        C2=mkClsr(pCPS2,...,K);
                                          C=mkClsr(fCPS,bEnv(args),K);
566
        waitRedCPS(C2,1,ADD,x,i-1);}
                                          enqueue(WL[tid],C); }
567
      void pCPS2(K){
                                          (*scheduler)(chSize); } }
568
       S3;
                                       (c) Translated OM-OpenMP Code.
       Invoke Continuation in K;}
569
                                       Only the changes are shown.
       int main(){
570
                                       void pCPS1(K){
       #ompparallel
571
                                        S2:
572
      #ompfor
                                        C2=mkClsr(pCPS2,bEnv(S3),K);
573
         for(Header){
                                        waitRedCPS(C2,1,ADDint,x,
          K=mkClsr(id,null,null);
                                          COPYint, i-1); }
574
          fCPS(K,args); } } }
575
                                       (d) OM-OpenMP Code with postpass.
576
           (b) UWOmpCPS<sub>pro</sub> code
                                       Only the changes are shown.
```

Figure 8. Example Transformations.

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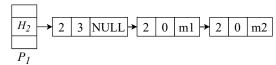
load factor set to a constant M%). Note that there are two straightforward alternatives to our proposed scheme: (i) each post-box entry  $P_i$ , is an array of N slots - no locking required among the activities communicating with any particular activity  $X_i$ , but leads to high space wastage. (ii) each post-box entry  $P_i$  is represented as a linked-list - low space overhead, but may lead to significant performance overheads due to the locking contention among the activities communicating with any particular activity  $X_i$ . We use the hash-maps as a middle ground for supporting communication among the activities. In Section 6 we discuss an optimization where we can further reduce the overheads of this hash-map based postbox to a large extent for the common case of all-to-all communication.

The exact configuration of the slots of each postbox entry depend on the type of communication: *signal-only*, *data-only*, or *mixed-mode*. We briefly explain the first two modes and then explain the *mixed-mode* type of postbox, in more detail.

Signal Only Postbox If the communicating activities are guaranteed to never send/receive any any data-messages, then we simply represent each slot in the hashmap as a list of pairs of the form (sender, counter). When an activity  $X_i$  wants to send a signal to  $X_j$ , we simply increment the counter of  $X_j$  in  $P_i$ . and for the receiving activity we atomically decrements the counter, if it is non-zero, and return 1. Else, we return 0 (indicating that the signal is not yet available).

struct Node{ int senderId; int sCounter; void \*
message; struct Node\* next; };

Figure 9. mixed-mode postbox: structure of the node.



**Figure 10.** Postbox example:  $X_2$  sends 3 signals and 2 data-messages to  $X_1$ .  $P_1$  is the postbox of activity  $X_1$  and  $H_2$  is the hashed-index of activity  $X_2$  in  $P_1$ .

Data Only Postbox If the communicating activities are guaranteed to send/receive only data-messages, then we represent each slot as a list of pairs of the form (sender, data-message). When an activity wants to send a data-message, we append the message to the appropriate list, and for the receiving activity we take out and return the first message of the sender available in the list. If no such message is available, we return NULL.

*Mixed-mode Postbox.* We use this type of postbox, when the communicating activities may send either type of messages. We implement each slot as a list, where each element of the list is of the form shown in Figure 9. Consider an element e of the form  $(j, \mathsf{ctr}, \mathsf{m}, \mathsf{next})$  in one of the lists of  $P_i$ . If  $\mathsf{ctr}$  is non-zero then e represents  $\mathsf{ctr}$  number of contiguous signals sent from  $X_j$  to  $X_i$ . Else, e represents a data-message  $\mathsf{m}$  sent from  $X_j$  to  $X_i$ . For example, Figure 10 shows an example list, on receiving the following signals/data-messages from  $X_2$  to  $X_1$ : signal, signal, signal, and data-messages  $\mathsf{m}$ 1 and  $\mathsf{m}$ 2.

When an activity has to send a data-message (Figure 11), we create a new node (of type Node), add the message to the node, and insert the node to the appropriate list. When an activity has to send a signal, we first search for the first node corresponding to activity  $X_j$  in the list L. If the node  $n_s$  is not found ( $n_s$ ==NULL), we create a new node with the counter field initialized with ctr and insert it to L, otherwise, we increment the corresponding counter.

Figure 12 show the pseudo-code for receiving a message. An activity wanting to receive a message (signal or datamessage), first checks if the list is empty. If so, we return NULL. Else, we search for the first node n of the required type sent from the sender  $X_j$ . If the node is not found, we return NULL. Else, if the type of the requested message is signal, we decrement the corresponding counter sCounter. Finally, if the node is a data-message (sCounter==0) or the last signal message, we delete the element from the list L.

Note: (I) The recvMsg routine is non-blocking in nature. The actual waiting, if at all, is performed by the wait-call invoking the recvMsg of the postbox. (II) We use a static analysis to decide which type of postbox is to be used, based on the signal/wait commands specified in the input program.

### 5.2 Signal Algorithm

We now describe the wrapper methods that are emitted by the CPS transformation (Section 4.1) to handle the signal

```
661
        1 void sendMsg(j, i, m, ctr) // send message m from X_i to X_i
662
        2 begin
               H_i=hashFunction(j);
663
               Acquire Lock on P_i.H_i;
664
        4
               L = P_i.H_i.list;
               if m \neq NULL then
                                                      // data-message
666
                   n = \text{create-node}(i, ctr, m); Insert n to L;
667
               else
668
                   n_s=search(i, j, signal); // search signal node
        9
                   if n_s == NULL then
       10
670
                       n = \text{create-node}(i, ctr, m); Insert n to L;
       11
671
       12
                   else
672
                       n_s.sCounter++;
       13
673
674
               Release Lock P_i.H_j;
675
```

Figure 11. mixed mode: send message.

1 Node\* recvMsg(i, j, tp) //  $X_i$  receives a message of type tp from  $X_j$ ;  $tp \in \{\text{signal, data-message}\}$ 

```
2 begin
       Node* n = NULL;
       H_i=hashFunction(j);
       Acquire Lock on P_i.H_j;
       L=P_i.H_j.list;
       if L not empty then
           n = \operatorname{search}(i, j, tp);
8
           if n == NULL then return NULL;
9
           if tp == signal then
10
               n.sCounter--;
11
           if n.sCounter==0 then n=Delete n from L;
12
       Release Lock P_i.H_i;
13
      return n;
```

Figure 12. mixed mode: Receive message, if available.

commands: The CPS transformation rules may emit any of the four signalling wrapper signalCPS, signalSendCPS, signalAllCPS and signalAllSendCPS. The first two methods take variable number of arguments, corresponding to the list of activities to whom the signal/message is to be sent. The wrapper methods signalCPS and signalAllCPS simply call signalSendCPS and signalAllSendCPS, respectively, by passing the message argument m as NULL. We now describe the signalSendCPS (Figure. 13) and signalAllSendCPS (Figure. 14) methods. An interesting point about these wrapper methods is that they are in CPS form and take the continuation K as an argument.

The method signalSendCPS first checks the predicate e. If true, it does the actual signalling by invoking sendMsg for each receiving iteration. Finally, it invokes the continuation. The design of signalAllSendCPS is similar, except that it stores the message of each sender i at the  $i^{th}$  element of a shared array msgArr (unique for each parallel-for-loop). This helps in performing the reduction operation.

```
void signalSendCPS(K, e, m, ...)

begin

if e == true then

p=Iteration list from the variable list of arguments;

from=K.iteration;

for each i ∈ p do sendMsg(from, i, m, 0);

Invoke the continuation in K;
```

**Figure 13.** Signal a set of activities with message *m*.

```
void signalAllSendCPS(K, e, m)

begin

if e == true then

N=endIdx-startIdx+1;
sendMsg(from, from, m, N);
if m != NULL then msgArr[from]=m;

Invoke continuation in K;
```

**Figure 14.** Signal all activities with message *m*. Here, *startIdx* and *endIdx* denote the starting and ending index number of the parallel-for-loop.

```
1 void waitRedCPS(K, e, rop', redVar, copy, ...)
      if e = = true then
          p=Iteration list from the variable list of arguments;
          iter=K.iteration;
          if rop' ==NULL then typeMsq=signal;
          else typeMsq=data-message;
          struct Node *aNode;
          for every iteration i in p do
               aNode=recvMsg(iter, i, typeMsg);
10
               if aNode==NULL then
11
                   aNode=recvMsg(i,i,typeMsg);
12
                   if aNode==NULL then
13
                       wClsr=mkWaitClsr(K,iVal,rop',redVar,copy,p);
14
                       wClsr.start=i;
15
                       acquireLock(lock);
16
                       enqueueClosure(WL[tid], wClsr);
                       releaseLock(lock); return;
18
               if typeMsg==data-message then
19
                   Perform the reduction operation rop' on
20
                    the message aNode.message and
                    reduction variable redVar;
      Invoke the continuation in K
```

Figure 15. Wait for a subset of activities with reduction

# 5.3 Wait Algorithm

We now describe the wrapper methods that are emitted by the CPS transformation (Section 4.1) to handle the wait commands: waitCPS, waitRedCPS, waitAllCPS and wait-AllRedCPS. The first two methods take as arguments the list of (target) activities from whom the signal/message is to be received. The wrapper methods waitCPS and waitAllCPS

```
1 void waitAllRedCPS(K, e, rop', redVar, copy)
771
       2 begin
772
              if e==true then
773
       4
                  iter=K iteration:
774
                  if rop' == NULL then typeMsg=signal;
       5
775
                  else typeMsg=data-message;
       6
776
                  struct Node *aNode;
       7
777
                  for every iteration i in [startIdx,endIdx] do
       8
778
                       aNode=recvMsg(i, i, typeMsg);
       9
779
                      if aNode==NULL then
       10
780
                           aNode=recvMsg(iter,i,typeMsq);
       11
781
                           if aNode==NULL then
       12
782
                               wClsr=mkWaitClsr(K,iVal,rop',redVar,copy,p);
       13
783
784
       14
                               wClsr.start=i;
785
                               acquireLock(lock);
       15
786
                               enqueueClosure(WL[tid], wClsr);
       16
787
                               releaseLock(lock); return;
       17
788
789
                  if typeMsg==data-message then
       18
790
                      lazyReduce(K);
       19
791
       20
                  else
792
                      Invoke Continuation in K
793
```

**Figure 16.** Wait for all activities with reduction. *startIdx* and *endIdx* denote the starting and ending indices of the parallel for loop.

simply call waitRedCPS and waitAllRedCPS, respectively, by passing the reduction specific arguments as NULL. We now describe the waitRedCPS and waitAllRedCPS methods. Similar to the signal wrapper methods, these methods are also in CPS form.

The method waitRedCPS (Figure. 15) first checks if the conditional-expression *e* is true. If so, it invokes the recvMsg function for each target activity (Line 9). In case any of the expected signal is not yet available, the function recvMsg returns NULL. Note that a thread executing an activity should not block, if there are other ready activities to be executed by that thread. Hence to ensure that the thread executing the wait-wrapper function does not block (or busy wait), we create a wait closure (using the macro mkWaitClsr by passing all the relevant information). The starting iteration number is saved indicating the information regarding already processed signals. This closure is marked to be executed later (Line 17). We execute the closure K, only if e is false or all the signals have been received. The waitAllRedCPS method works similarly, by waiting for all the messages to be available before performing the reduction. The differences can be observed by considering the Lines 19-21 in Figure 15, and Lines 18-21 in Figure 16.

#### 5.4 Reduction Operations

We now highlight some salient points about our reduction strategy. Figure 15 shows a simple eager way of reduction which invokes the reduction operation (rOp') eagerly, on the

```
void scheduler-static(chSize)
begin // chSize unused; work already divided.
executeWL(WL[tid]);
```

Figure 17. UWOmp $_{pro}$  static scheduling algorithm.

value stored in rVar and the message from the sender activity aNode.message (Line 19), as and when the message is read. In contrast for the all-to-all synchronization (waitAllRedCPS), we efficiently perform the reduction after all the messages have been received (in a lazy manner, Line 18 in Figure 16). We describe the intuition behind this design decision below.

One main drawback of the eager method of reduction is that it is inherently serial in nature; hence each activity may take up to O(M) steps for reduction, where M is the number of activities participating in reduction. While for small values of M this cost may be minimal, it can be prohibitively high, for large values of M; a common use-case being performing all-to-all reduction (realized by consecutive calls to signalAllSend and waitAllRed commands of UWOmp $_{pro}$ ). To address this issue in case of all-to-all reduction we use the lazy mode of reduction. The algorithm works on the principle of the popular parallel message-exchange based protocol [25] that leads to each activity performing O(log(M)) steps. However, for small values of M, we continue to use the eager mode and avoid the storage overhead of the shared array.

# 5.5 Supporting Different Scheduling Policies

UWOmp++ [3] could not handle any scheduling policies of OpenMP except static scheduling. Considering the importance of scheduling policies beyond static, we also provide support for *dynamic*, *guided* and *runtime* scheduling.

As discussed in the Section 4.2, if the programmer specified scheduling policy is one of static, dynamic, or guided, then the translated code invokes the appropriate scheduler. Recall that for runtime-scheduling, we emit additional code immediately before each parallel-for-loop. We now discuss the details of the former three schedulers.

static scheduler. The scheduler function scheduler-static (Figure 17) simply executes all the closures present in WL[tid]. We skip the definition of executeWL for brevity. If we are using static scheduling, each thread maintains its own local worklist and as a result, in the waitRedCPS function (described earlier in Section 5.3), the locking mechanism before and after the enqueue operation is not required.

dynamic-scheduler. As discussed in Section 4.2, for dynamic (and guided) scheduling we use the the global worklist. In the dynamic-scheduler function (Figure 18), each thread atomically dequeues (at most) *chSize* number of closures from the worklist and executes them.

guided-scheduler. Our scheduler-guided function works similar to the dynamic scheduling function, except that the chunk-size *chSize* is updated after each atomic dequeue. We skip the code for the same, for brevity.

```
void scheduler-dynamic(chSize)
begin

WorkList rdyWL=empty-worklist;
while true do
begin Atomic
if !globalWL.isEmpty() then
rdyWL=globalWL.dequeue(chSize);
else break;
executeWL(rdyWL);
```

**Figure 18.** UWOmp $_{pro}$  dynamic scheduler algorithm.

### 6 Discussion

 We now discuss two salient features of our proposal.

- **Memory management.** Considering the overheads of CPS translation, we reuse many of the well known optimizations [3, 4, 27] to optimize the memory usage and malloc/free calls for closures. For simplicity, we also do not show the places where the closures are freed, though we do free them at the appropriate places in the actual implementation.
- Optimization for Static Scheduling: To minimize the memory and maintainance overhead of postbox in all-to-all based synchronization kernels and static scheduling policy, we use an optimized approach. For static scheduling policy, the work per thread is fixed a priori and thereby, the worklist is implemented as a single array of closures with two pointers, (*left* and *right*) per thread. In it, each thread executes the set of closures from *left* to *right*. When hit with a barrier, the thread only resumes executing the continuation once it finishes executing all the other activities in its worklist (*left* != *right*) and then waits for other threads to finish.

# 7 Implementation and Evaluation

We implemented our proposed language extension, translation and the runtime support for  $\mathsf{UWOmp}_{pro}$  in two parts: (i) the translator has been written in Java [5] in the IMOP Compiler Framework [22] - approximately 8000 lines of code (ii) the runtime libraries are implemented in C [20] - approximately 2000 lines of code. IMOP is a source-to-source compiler framework for analyzing and compiling OpenMP programs. To compile the generated OpenMP codes, we used GCC with -O3 switch (includes tail-call optimization).

We evaluate our proposed translation scheme and the runtime using 14 benchmark kernels from various sources (details in Figure. 19). These include all the kernels used by Aloor and Nandivada [3] (except FDTD-2D, which we could not compile/run using the baseline compiler of Aloor and Nandivada) and a few additional kernels: WF, Jacobi1D, Stencil4D, and HP. For each kernel, we indicate the type of synchronization needed and if it uses reduction operations. Note that point-to-point kernels, can also be written using all-to-all synchronization.

SN	Bench[Src]	I/P	A2A	P2P	reduction
1.	3MM [24]	8K	✓		
2.	LCS [23]	32K	✓		
3.	MCM [12]	32K	✓		
4.	WF [24]	32K	✓		
5.	LELCR [17]	128K	✓		
6.	GEMVER [24]	64K	✓		
7.	KPDP [24]	128K	✓		
8.	Jacobi1D [24]	128K		✓	
9.	Jacobi2D [24]	128K		✓	
10.	Stencil4D [29]	128K		✓	
11.	SOR [8]	128K		✓	
12.	Seidel2D [24]	128K		<b>√</b>	
13.	IA [14]	4K	✓	<b>√</b>	<b>√</b>
14.	HP [7]	4K	✓	✓	✓

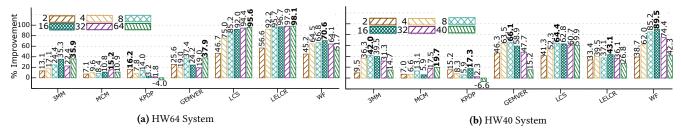
**Figure 19.** Benchmarks used in UWOmp $_{pro}$ . Abbreviations: A2A = all-to-all, P2P = point-to-point.

To demonstrate the versatility of our proposed techniques, we performed our evaluation on two systems: (i) Dell Precision 7920 server, a 2.3 GHz Intel system with 64 hardware threads, and 64 GB memory, referred to as HW64. (ii) HPE Apollo XL170rGen10 Server, a 2.5 GHz Intel 40-core system, and 192GB memory, referred to as HW40. All numbers reported in this section are obtained by taking a geometric mean over 10 runs. For each benchmark kernel we chose the largest input such that the 10 runs of the UWOmp<sub>pro</sub> kernel would complete within one hour on HW64. In this section, for a language  $L_x$ , we use the phrase "performance of an  $L_x$  program" to mean the performance of the code generated by the compiler for  $L_x$ , for the program written in  $L_x$ .

We show our comparative evaluation across four dimensions: (i)  $UWOmp_{pro}$  kernels that perform all-to-all synchronization with no reduction operations (kernels 1-7); we compare the performance of these UWOmp<sub>pro</sub> codes against their UWOmp++ counterparts. (ii) UWOmppro kernels that perform only point-to-point synchronization, with no reduction (kernels 8-12); we compared their performance with that of their all-to-all versions written in UWOmppro and standard OpenMP. Note: we could not successfully run the code generated by the UWOmp++ compiler for the all-to-all UWOmp++ versions of these codes and hence we do not show a comparison against these codes. (iii) UWOmp<sub>pro</sub> kernels that perform reduction operations (kernels 13-14); we compare the performance of these kernels with their OpenMP original benchmarks. We first rewrote these kernels to use our reduction algorithm and compare them with their standard OpenMP benchmarks. (iv) Impact of the scheduling policy; we present a comparative behavior of all the 14 kernels by varying the scheduling policies.

# 7.1 Evaluation of all-to-all synchronization

For the benchmark kernels 1-7, Figure 20 shows the percentage improvement of UWOmp $_{pro}$  codes over their UWOmp++ counterparts, for varying number of threads. On HW64, we



 $\textbf{Figure 20.} \ \ \text{Performance of UWOmp}_{pro} \ \ \text{kernels with all-to-all synchronization (Vs. UWOmp++ kernels), for varying \#threads.}$ 

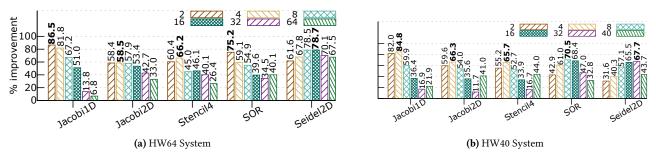


Figure 21. Performance of UWOmp<sub>pro</sub> kernels with point-to-point synchronization (Vs. OpenMP), for varying #threads.

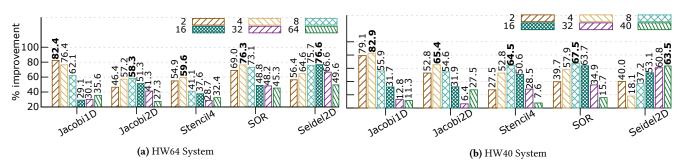


Figure 22. Performance of UWOmp $_{pro}$  kernels with point-to-point synchronization (Vs. All2All), for varying #threads.

varied the threads from 2 to 64 (in powers of 2) and on HW40, we varied the threads from 2 to 40 (in powers of 2 and 40).

Our evaluation shows that except for KPDP in one particular configuration (64 cores on HW64 and 40 cores on HW40), the UWOmp<sub>pro</sub> codes perform better than their UWOmp++ counterparts. Even for that particular configuration the performance degradation is minimal (<7%). One common pattern we find is that if a kernel has a lot of computation (for example, LELCR, LCS and WF) UWOmp  $_{\it bro}$  outperforms UWOmp++ significantly, in contrast to kernels with very low computation (for example, KPDP and MCM) where our comparative gains are less. Overall, we find that the percentage improvements varied between -4.0% to +98.1% on the HW64 system and between -6.6% to +89.5% on the HW40 system. We believe that such significant performance gains are mainly due to our efficient handling of worklists (single local worklist vs two separate worklists in UWOmp++), and being conservative in converting only the essential parts of the code to CPS form.

Note that we avoid showing a comparison with the OpenMP counterparts of these benchmarks as Aloor and

Nandivada [3] have already shown that UWOmp++ programs run faster than the plain OpenMP programs, and in this evaluation we show that UWOmp<sub>pro</sub> programs fare significantly better than their UWOmp++ counterparts.

#### 7.2 Evaluation of point-to-point synchronization

For the benchmark kernels 8-12, Figure 21 summarizes the percentage improvement of the point-to-point variants of the codes compared to OpenMP, for varying number of threads, on both HW64 and HW40 systems. Figure 22 summarizes the percentage improvement of the point-to-point variants of the codes compared to the all-to-all UWOmp $_{pro}$  versions, for varying #threads. We see a significant performance improvement obtained when using point-to-point synchronization routines over that of OpenMP. The percentage improvement varied between 6.8% to 86.5% on HW64, and between 6.9% to 84.8% on HW40 when compared with OpenMP. The percentage improvement varied between 27.3% to 82.4% on HW64, and between 6.4% to 82.9% on the HW40 system when compared with the all-to-all versions of UWOmp $_{pro}$ .

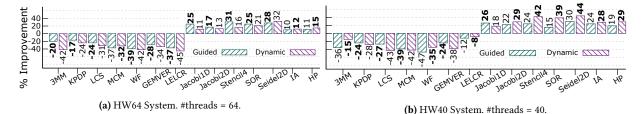
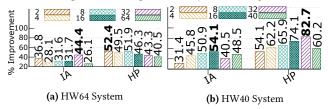
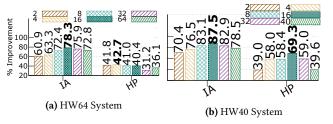


Figure 23. Comparison of dynamic and guided scheduling over static scheduling; #threads set to maximum #cores.



**Figure 24.** Performance of UWOmp $_{pro}$  kernels using the proposed reduction scheme (Vs. OpenMP), for varying #threads.



**Figure 25.** Performance of UWOmp $_{pro}$  kernels using the proposed reduction scheme (Vs. All2All), for varying #threads.

The main reason of this improvement is due to the lesser amount of communication (and faster execution) in point-to-point synchronization compared to all-to-all synchronization in OpenMP. For most of the kernels we see that the performance improvement reduces gradually with the increasing number of threads. This is mainly because the main overhead in all-to-all synchronization is the waiting time incurred by all the activities. As the number of threads increase, the overall waiting time gets amortized better and leads to a reduction in the overhead.

#### 7.3 Evaluation of reduction kernels

For the benchmark kernels 13-14, Figure 24 shows the percentage improvement obtained using our proposed reduction scheme against the standard OpenMP benchmarks (using the OpenMP reduction clause wherever possible). We see that the proposed scheme performs significantly better. The percentage improvement varied between 26.1% to 52.4% on HW64, and between 31.4% to 82.7% on HW40 when compared with OpenMP.

As a point of reference, we also compared our generated codes using the techniques discussed in this paper (use parallel reduction operation) against that in which one of the activities  $X_1$  performs the reduction operation in serial. We have found that the parallel reduction operation clearly outperforms the serial one: the percentage improvement varied between 31.2% to 65.4% on HW64, and between 39.0% to

78.9% on the HW40 system when compared with all-to-all versions with sequential reduction of UWOmp $_{pro}$ . Figure 25 shows the detailed graphs for this comparison.

### 7.4 Evaluation of different schedules

To show the importance of allowing different scheduling policies and the efficacy of our implemented dynamic and guided schedulers, we present an evaluation of all the kernels for different scheduling policies. Figure 23 shows the percentage improvement of dynamic and guided scheduling compared to static scheduling; due to lack of space, we show this evaluation only for a fixed number of threads (set to the maximum available hardware cores in the system). For dynamic scheduling, the percentage improvement varied between -45% to +32% on the HW64 system, and between -43% to +44% on the HW40 system. Similarly, for guided scheduling, the percentage improvement varied between -39% to +31% on the HW64 system, and between -47% to +30% on the HW40 system. Such significant variance clearly attests to the importance of supporting different scheduling policies and the efficacy of our implemented schedulers.

Further, we observe that for IA and HP kernels, the gains due to dynamic and guided schedules is less. We believe that it is due to the presence of all-to-all reduction operations in those kernels that seem to work better with static scheduling. For most kernels that do not use reduction operations, we find that the dynamic and guided policies work better.

# 8 Related Work

There have been multiple efforts [16, 21, 26, 30] to utilize continuations to extend and translate parallel programs. Fischer et al. [15] provide a modular approach to do a CPS translation of event-driven programs in Java. For the Cilk language, Blumofe et al. [6] propose a C-based runtime with a workstealing scheduler useful for multithreaded programming, which uses continuations to spawn and join tasks. Our translation scheme and the underlying runtime take advantage of CPS to efficiently perform wait and continue operations, and support different scheduling policies, along with efficient reduction operations.

For HJ, Imam and Sarkar [18] propose the idea of one-shot delimited continuations (OSDeCont) to support cooperative scheduling and event-driven controls. One main restriction in their approach is that it works only for help-first and work-first approaches of work-stealing. Our translation takes inspiration from their approach, but generalizes the techniques so

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that we are not limited to specific scheduling policies and our scheme works in the context of OpenMP parallel-for-loops.

# 9 Conclusion

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In this paper, we present UWOmp $_{pro}$  that allows point-to-point synchronizations and reduction operations, among the activities of parallel-for-loops of OpenMP. We present a scheme to compile UWOmp $_{pro}$  codes to efficient OpenMP code. We have also designed a runtime, based on a novel postbox based communication subsystem to support efficient signal and wait functions, along with reduction operations and arbitrary schedules of OpenMP. We have implemented our scheme in the IMOP compiler framework and performed a thorough evaluation. We argue that programmers can write expressive and performant codes using UWOmp $_{pro}$ .

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