# **UPC Collectives Library 2.0**

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# ABSTRACT

Collective communication has been a part of the UPC standard since having been introduced in 2005 with the UPC Specification version 1.2. However, unlike MPI collectives, UPC collectives have never caught on and are rarely used.

In this paper we identify and discuss several fundamental limitations and important missing features in the design of the existing UPC collectives that make them inconvenient to use and unsuitable for performance optimization.

Next, we propose a new, consistent, portable and high performance collectives library that is aimed to augment UPC with a full complement of the collectives used by MPI. Ours is a pure library based approach; we change none of the functions in the existing UPC specification.

We discuss the implementation requirements for this new UPC collectives library, and how our design attempts to minimize the implementation effort by enabling the reuse of existing collective implementations.

# 1. INTRODUCTION

The notion of collective communication has been popularized by the MPI library [10]. MPI collective primitives are able to express fairly complex combinations of data movement, synchronization and computation operations, and have become well understood tools, or programming patterns, in the arsenal of people writing programs for large parallel machines [7, 15, 16, 14, 8]. Collective communication primitives are anchored in the SPMD programming model, but transcend programming languages. Variations on collective communication have found their way into most modern parallel programming languages, including Partitioned Global Address Space (PGAS) languages [18, 17, 13, 19, 6, 2, 5].

The UPC Specification Version 1.2 [17] contains a number of collective communication operations. It is

our contention, and the premise of this paper, that the current standard is flawed and insufficient.

- The current UPC specification lacks equivalents to some of the most popular MPI collectives. Canonical examples include MPI\_Allreduce (vector reduction with results propagated to every participant) and MPI\_Alltoallv (personalized communication with variable amount of data).
- The UPC specification lacks the concept of a *team* (or, in MPI parlance, *communicator*. Teams are used to denote subsets of UPC threads to run collectives on. In MPI communicators are of crucial importance: they allow code reuse, and therefore, the development of MPI libraries. We anticipate that a careful design of teams in UPC will help achieve the same purpose.
- The UPC specification is unclear on the correct use of synchronicity flags on collectives. We have anecdotal evidence that the UPC synchronicity flags seem to be hard to master for novice users, and our experience with implementations of the standard suggests that the complexity is not really warranted by the putative improvement in performance that it makes possible.
- The UPC specification has non-blocking barriers, but no other non-blocking collectives. The (fairly complicated) synchronizing flags specification is supposed to allow for overlap of collectives, but this turns out to be awkward for users and difficult for implementors.

The remainder of this work is our proposal to mitigate these problems. In Section 2 we lay out the principles of our approach. Section 3 lays out our new proposed API: type definitions and function prototypes.

No performance results: we do not show any performance results in this paper. Two separate implementations are underway, under the auspices of the authors' host institutions, but neither implementation is ready for in-depth performance testing at press time.

Since we expect implementors to reuse MPI collectives to implement the UPC collectives library 2.0, the

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expected performance profile of UPC collectives is not substantially different from that of MPI collectives. ALL-SYNC flags form a notable exception, as their presence may add latency to execution.

# 2. GENERAL APPROACH

In this Section we describe our approach to define a comprehensive collective communication library compatible with the UPC language.

We do **not** propose to change any existing UPC functionality. We are not changing the semantics of anything that is already defined in the UPC specification 1.2, including collective functionality.

Instead, we propose to define a new library of collective communication primitives with a new API. This API ought to be more familiar to those using collective communication calls in MPI code, and in line with what the MPI forum [9] is proposing for the MPI 3.0 standard [11]. Indeed, we are hoping to enable the reuse of existing MPI collective libraries in UPC.

# 2.1 Teams

*Teams* are arbitrary named subsets of UPC threads that collective communication operations can be invoked on. In MPI they are called *communicators*. The current UPC specification does not provide for team based collective communication; we propose to add them to our library.

We start with a small set of functions to manage the life cycle (creation, destruction) of UPC teams. A UPC team is either pre-defined (like UPC\_TEAM\_ALL, meaning all threads) or created with a function like upc-coll\_team\_split(), as defined in Section 3.4.

Just like in MPI, team life cycle functions are themselves collectives and have synchronizing properties, so as to avoid situations in which e.g. a broadcast message on a newly created team overtakes the message informing the target UPC thread about the creation of the team.

# 2.2 Shared arrays and collectives

UPC Spec 1.2 collectives are "single-valued": all UPC threads participating in a collective are required to submit the *same* buffer as argument; failure to do so results in undefined behavior. Furthermore, while arguments to collective calls are all typed as **shared void** \* or similar, operation semantics interpret them as shared arrays with finite (but variable) blocking factors.

The obvious limitation of this approach is that only a single shared array can be involved in a collective at a time, frequently necessitating local memory copies before and after the operation. The implicit type cast part of most collective operations also complicates the writing of correct code, since what looks like a contiguous index space to the user is broken up into strided accesses in the collective and vice versa.

Our proposed API corrects this problem by relaxing some of the requirements on user buffers, and moving the interface closer to an "MPI-like feel."

- We allow multi-valued arguments. In other words, different threads can specify different pointers-to-shared in a call to the same collective.
- We require that the buffers submitted in each collective call be affine to the calling thread. Each thread processes data that actually is affine to that thread.
- UPC collectives operate on shared memory buffers. We do not allow UPC collectives to operate on thread-local memory.
- Pointer-to-shared arguments are always interpreted as having indefinite blocking factors (in effect, pointing to contiguous areas of memory).

# 2.3 Non-blocking collectives

The Berkeley UPC compiler [1] provides an asynchronous memory operator extensions (upc\_memget\_async and friends). This extension is now being proposed as a standard library for UPC [4]. Non-blocking operations have been shown to be effective to improve application performance [3, 12].

We propose similar syntax for non-blocking UPC collectives. The idea is to allow the collective call to return without having completed. The user receives a token for the collective in progress. As in MPI, the token **must** be checked for completion; the collective call completes when the check function upc\_wait returns true.

In order to keep the number of collective primitives down, we use an extension of the SYNC flags, described in detail in Section 3.1.2, to specify non-blocking collective calls. We allow three flavors of collective calls: blocking calls, non-blocking calls with explicit synchronization, and non-blocking calls that are synchronized at next invocation of upccoll\_fence() (see Section 3.3 for a complete description).

# 2.4 Buffer ownership rules

The MPI standard is very exact about the life cycle and ownership of data buffers passed between users and MPI functions. The principle on which MPI operates is that any buffer passed to MPI cannot be touched by the user (either read or write) until the MPI function is complete. We adopt this principle for buffer ownership for UPC collective calls.

**UPC collective buffer ownership rule:** ownership of data involved in collective operations is considered transmitted to the collective upon invocation on each thread, and returned to the user upon completion. The violation of this rule can have unpredictable consequences with respect to completion and results of the collective calls.

The enforcement of the buffer ownership rule is typically left to users. In MPI, and without non-blocking collectives, enforcement is relatively trivial because control is transferred in sync with buffer ownership, leaving no opportunity for the user to execute any offending code.

Non-blocking collectives permit users to violate the ownership rule in multiple ways - by starting a second collective or running other code that accesses memory regions overlapping with buffers already given to the non-blocking collective.

One-sided remote access to buffers in shared memory also give third-party threads (not part of the team executing the collective) the ability to violate the buffer ownership rule.

UPC collective synchronization flags affect the definition of the start and completion of collectives. IN\_ALLSYNC delays the transfer of buffer from the user to the collective to the point when all participants have started the collective; OUT\_ALLSYNC delays completion of the collective on any thread to the point where all other threads are also finished. We discuss sync flags in detail in Section 3.1.2.

# 2.5 Ordering and synchronization of collective operations

Our proposed UPC collectives API supports both blocking and non-blocking collectives. We propose to allow multiple non-blocking collectives, even of the same kind, to be in progress on the same team at the same time. This can lead to non-trivial problems regarding the completion and ordering of collectives, which we must now examine.

The UPC specification introduces six synchronization flags to control data access by collectives. In our experience only two of those six flags are really necessary: UPC\_IN\_ALLSYNC and UPC\_OUT\_ALLSYNC. We describe the proposed syntax in Section 3.1.2; in this section we examine the effect of synchronization flags on collective ordering.

### 2.5.1 Ordering of blocking collective operations

A blocking collective operation is completed before returning from the function call. Thus any one UPC thread cannot have two blocking collectives in-flight at the same time; for a single thread, program order defines the order in which collectives are executed.

We thus have a simple definition for total order for collectives executing on one thread. The situation is less simple, however, when multiple partially overlapping teams of threads are involved. We define ordering of collectives by means of the directed graph G(V, E) as follows:

- The vertices V of the graph are all collective operations executed in a program.
- A directed edge  $v_1 \rightarrow v_2 \in E$  is defined for any pair of collectives where  $v_1$  precedes  $v_2$  on any thread in the program.

Rule for correct ordering for collectives: With

the graph defined as above, a UPC program involving collectives is correct only if the directed graph G(V, E) described above has no cycles. The (acyclic) graph also defines a partial order on the execution of collectives in the program. On the other hand if the graph contains any cycles, the corresponding program is faulty and will deadlock.

Synchronization rules for blocking UPC collectives: UPC collectives' synchronization properties are guided by synchronization flags. Execution of a UPC collective on any one thread may be synchronized by activity on other threads, especially when the ALLSYNC flags are set.

**Discussion:** Most MPI collective library implementations have synchronizing properties beyond what is necessary for correctly implementing a particular collective. For example, in an MPI broadcast it is not necessary to synchronize two participating non-root tasks with each other, only with the root; however, most MPI broadcast implementations fully synchronize every pair of participating tasks. The MPI standard warns users not to rely on this property, since it is not intrinsic to the collectives themselves, only a property of the implementation. We make the same stipulation for UPC collectives, subject to synchronization flags.

Advice to users: do not rely on UPC collective calls being synchronizing unless the appropriate sync flags are set.

Advice to implementors: blocking collective implementations are allowed to synchronize the completion of any collective on every executing thread. Correct implementation of ALLSYNC flags requires this, but implementors are free to synchronize threads even when ALLSYNC flags are not specified by the user.

# 2.5.2 Ordering of non-blocking collective operations

Each non-blocking collective operation involves two function calls: an initiation call and a completion wait call. A non-blocking collective operation is in-flight when the initiation call is invoked and is complete once the completion wait call returns.

**Ordering non-blocking collectives:** We order nonblocking collectives by their initiation calls. This approach is consistent with the MPI3 specification and allows construction of the same graph described in Section 2.5.1.

Completion calls are then allowed to be in any order (although they obviously have to follow the initiation calls on the same thread).

Advice to users: A non-blocking collective operation is guaranteed to be complete upon return from upccoll\_wait or upon upccoll\_test returning the value 1. However, the collective can complete any time between the initiation call and the completion call. The completion order of multiple in-flight collective operations varies across implementations and different executions. Users should not assume completion orders of collectives beyond the semantics defined by their respective definitions.

Synchronization rules for non-blocking collectives: We clarify this by reusing the collective ordering graph defined in Section 2.5.1. Let us consider the collective start calls  $S_i, i \in 0..P - 1$  and completion calls  $W_i, i \in 0..P - 1$  for a particular collective invocation on P threads. Both S and W are vertices in the collective dependence graph G(V, E).

- 1. We allow edges from any  $S_i$  to any  $W_j$  vertices (only from S to W, obviously). On any one thread *i* the initiation call has to precede the completion call; the completion call is allowed to block waiting for the initiation call on potentially all threads.
- 2. We disallow edges between any two  $S_i$  vertices. In vernacular, collective initiation calls should never block waiting initiation of the same collective on other threads. This is a common-sense requirement to allow multiple non-blocking collectives to be launched simultaneously.

Advice to implementors: The initiation call of any non-blocking collective should never block waiting on any pending activity on some other thread, not even when IN\_ALLSYNC is specified in the call. IN\_ALLSYNC simply means that the execution of the collective cannot begin until every thread has started it; it does not constrain the return of the initiation call.

3. We disallow edges between any two  $W_i$  vertices. Collective completion calls do not block waiting for completion calls on other threads: they only block waiting for initiation calls on other threads. This results from the common-sense definition of barrier synchronization - the strongest synchronization of all - which states: "a thread is free to *leave* a barrier when every other thread has *entered* the barrier".

Advice to implementors: The completion call of any non-blocking collective should never block waiting for the corresponding completion call on any other thread, not even when OUT\_ALLSYNC is specified in the call. OUT\_ALLSYNC simply means that the collective is complete when the first completion call returns, but this is not subject to completion calls having been invoked on any other threads.

**Discussion:** First, we should note that the subgraph corresponding to a single non-blocking collective invocation is bipartite, as only edges between S and W are allowed.

The strongest synchronization allowed corresponds to an edge between every pair of  $W_i$  and  $S_j$  edges (a complete bipartite graph). This synchronization corresponds to a non-blocking barrier. As in the case of blocking collectives, this type of synchronization is only required by ALLSYNC flags, therefore users should not rely on it unless they specified ALLSYNC. Advice to users: Do not rely on non-blocking collectives fully synchronizing every thread, unless the ALL-SYNC flags are specified.

Advice to users: The example code in Figure 1 should not deadlock when executed on multiple threads, even when the collective ALLSYNC flags are specified.

# **2.6** Issues not addressed by our approach

Our present effort to better integrate collective communication into UPC is not complete. We prioritized our approach based on the immediate usefulness of proposed features, and stayed away from topics where discussion in the community is too widely divergent to give us hope of agreement.

- We have not considered MPI-like persistent collectives. We tried very hard to limit the amount of syntax bloat we are adding to the library, and persistent collective communication simply did not make it to the list of included features.
- We have not provided any team management functions other than split. We are well aware of the comparative richness of e.g. MPI in creating new teams by e.g. enumeration. We consider **split** by far the most useful of all team creation primitives, and we are open to further expansion of this functionality in the future.
- We have not considered the effect of teams on UPC index calculation and operations like upc\_global\_alloc(). As we mentioned at the beginning of this Section, our approach does not allow us to change existing language semantics. Even adding a new form of team-based global\_alloc would have invited the question of how to enumerate (index) the new allocated data structure; this would have been impossible without wide-ranging changes in the semantics of the language.
- We have not considered user defined types such as provided by type constructors in the MPI standard.
- We have not considered value-based collectives, that is UPC collectives on private data. All collectives presented in this paper operate on shared data.
- We have not considered the oft-discussed and published, but never agreed-on concept of one-sided collectives.

/* EX1: lock across s	tart */	/* EX2: lock across v	vait */
upccoll_handle_t upc_lock_t	h; lock;	upccoll_handle_t upc_lock_t	h; lock;
 upc_lock collective_start upc_unlock	<pre>(lock); ( h); (lock);</pre>	 collective_start upc_lock upccoll_wait	( h); (lock); (h);
upccoll_wait	(h);	upc_unlock	(lock);

Figure 1: Code sequence EX1 executes a collective start in an atomic section, and will only execute correctly if *collective starts* are non-blocking. Sequence EX2 executes collective completion in an atomic section, and will only complete without deadlock if *collective completions* are not synchronized to each other. Together the two examples enforce the bipartite nature of the dependency graph between collective starts and completions.

# 3. THE UPC COLLECTIVES 2.0 API

In this section we describe the UPC Collectives API, version 2.0. The API consists of constants, type definitions and function prototypes.

# **3.1** Type definitions

The UPC Collectives 2.0 API extends types already present in the current UPC specification, but also introduces new types for new concepts.

### 3.1.1 Collective handles

### Synopsis

typedef void\* upccoll\_handle\_t;

#define UPCCOLL\_INVALID\_HANDLE 0

### Description

- 1. We define the opaque type upccoll\_handle\_t to represent ongoing collective operations. Handles are returned by non-blocking collective calls, and are also used to test and wait for collection completion (described in Section 3.3).
- 2. The value 0 is not valid for an ongoing collective.

### 3.1.2 Collective flag constants

### Synopsis

```
typedef int upccoll_flag_t;
```

```
#define UPC_IN_NOSYNC 1 /* obsolete */
#define UPC_IN_MYSYNC 2 /* default */
#define UPC_IN_ALLSYNC 4
#define UPC_OUT_NOSYNC 8 /* obsolete */
#define UPC_OUT_MYSYNC 16 /* default */
#define UPC_OUT_ALLSYNC 32
#define UPC_ASYNC_FENCE 64
```

### Description

1. This section describes a set of flags that can be specified in the invocation of every collective. The flags affect buffer ownership at the beginning and at the end of a collective, as well as control over the collective function's termination.

- 2. While all flags defined by the current UPC specification are available in the collectives library, we consider all but three of the flags obsolete and discourage their use. In particular, we consider UPC\_IN\_NOSYNC and UPC\_OUT\_NOSYNC obsolete and to be avoided. We consider UPC\_IN\_MYSYNC and UPC\_OUT\_MYSYNC to correspond to default behavior and therefore do not encourage their explicit use.
- 3. Buffer ownership is transferred from the user to the system at the moment when a collective is invoked, and is transferred back to the user when the collective terminates. Unless either of the ALL-SYNC flags are specified, buffer ownership is transferred to and from the collective locally, without regard to what other threads are doing. For example, late completion of a collective on a remote thread does not prohibit the local thread (where the collective is already complete) from accessing the results.
- 4. UPC\_IN\_ALLSYNC and UPC\_OUT\_ALLSYNC change buffer ownership transfer. With IN\_ALLSYNC buffer ownership is not transferred to the collective until *every* participant has invoked the collective. With OUT\_ALLSYNC no collective is allowed to terminate until all threads are ready to relinquish ownership of buffers.
- 5. UPC\_ASYNC\_FENCE is the flag that marks a nonblocking collective that will complete at the next call to upccoll\_fence() (Section 3.3).
- 6. Advice to users: Beware of improper access to shared memory in collectives. There is no mechanism in this specification, or in UPC, to prevent third-party threads from accessing and polluting data processed by collectives. When a team collective is executed on a proper subset of all UPC threads, threads not participating in the collective may inadvertently touch user buffers at the wrong time, producing unexpected results.

- 7. Advice to implementors: The simplest way to implement UPC\_IN\_ALLSYNC and UPC\_OUT\_ALLSYNC is by a combined barrier synchronization and memory fence executed at the beginning or the end of the collective, respectively.
- 8. Advice to implementors: Our list includes all flags introduced in the UPC specification. These definitions, less UPC\_ASYNC\_FENCE, should already be available from the standard include header file upc\_collectives.h. Judicious use of conditional macro definitions could solve this problem.

# 3.1.3 Collective arithmetics

### Synopsis

typedef enum {		
UPC_ADD, /*	Addition (all types)	*/
UPC_MULT, /*	Multiplication (all types)	*/
UPC_AND, /*	Bitwise AND (fixed-point values)	*/
UPC_OR, /*	Bitwise OR (fixed-point values)	*/
UPC_XOR, /*	Bitwise XOR (fixed-point values)	*/
UPC_LOGAND,/*	Logical AND (all types)	*/
UPC_LOGOR, /*	Logical OR (all types)	*/
UPC_MIN, /*	Minimum value (all types)	*/
UPC_MAX, /*	Maximum value (all types)	*/
UPC_MINLOC,/*	Find the minimum value and its location	*/
UPC_MAXLOC,/*	Find the maximum value and its location	*/
UPC_PREDEFINE	D_OPS /* Number of pre-defined UPC ops	*/
}		

### upccoll\_op\_t;

### Description

- 1. Some of the constants introduced here will be familiar to current users of UPC. They are defined in Section 7.3.2 of the UPC specification.
- 2. Just like in the UPC specification, the bitwise operators are not defined for floating point operands.
- 3. New types introduced in this document include UPC\_MAXLOC and UPC\_MINLOC. These operators work like in MPI.

#### 3.1.4 User-defined collective operations

### Synopsis

typedef void upccoll_user_fun	(void void size_t upccoll_dtype_t	*	in, inout, len, dt);
upccoll_return_t upccoll_op_create	<pre>(upccoll_user_fun int upccoll_op_t</pre>	*	<pre>function, commute, op);</pre>
upccoll_return_t upccoll_op_free	(upccoll_op_t		op);

### Description

- 1. The upccoll\_op\_create function creates a userdefined operation that can be subsequently used in computational collectives including upccoll\_reduce, upccoll\_allreduce, upccoll\_reduce\_scatter and upccoll\_scan. The new operation bound to the user-defined function is returned in **\*op**.
- 2. The user-defined operation is always assumed to be associative. If commute is 1, the operation is commutative. If commute is 0, the operation is non-commutative and the order of operands is fixed as ascending UPC thread rank order in the team participating the collective.
- 3. The upccoll\_op\_free function frees a user-defined operation.

# 3.1.5 Built-in collective data types

### Synopsis

typedef enum {			
UPC_BYTE,	/*	sizeof(unsigned char)	*/
UPC_CHAR,	/*	sizeof(char)	*/
UPC_UCHAR,	/*	<pre>sizeof(unsigned char)</pre>	*/
UPC_SHORT,	/*	sizeof(short)	*/
UPC_USHORT,	/*	sizeof(unsigned short)	*/
UPC_INT,	/*	<pre>sizeof(integer)</pre>	*/
UPC_UINT,	/*	<pre>sizeof(unsigned integer)</pre>	*/
UPC_LONG,	/*	sizeof(long)	*/
UPC_ULONG,	/*	<pre>sizeof(unsigned long)</pre>	*/
UPC_LONGLONG,	/*	<pre>sizeof(long long)</pre>	*/
UPC_ULONGLONG,	/*	<pre>sizeof(unsigned long long)</pre>	*/
UPC_FLOAT,	/*	<pre>sizeof(float)</pre>	*/
UPC_DOUBLE,	/*	sizeof(double)	*/
UPC_LONGDOUBLE,	/*	<pre>sizeof(long double)</pre>	*/
UPC_CPLX,	/*	2*sizeof(float)	*/
UPC_DBLCPLX,	/*	2*sizeof(double)	*/
UPC_LONGDBLCPLX,	/*	2*sizeof(long double)	*/
UPC_FLOAT_INT,	/*	<pre>sizeof(float)+sizeof(int)</pre>	*/
UPC_DOUBLE_INT,	/*	<pre>sizeof(double)+sizeof(int)</pre>	*/
UPC_LONG_INT,	/*	<pre>sizeof(long)+sizeof(int)</pre>	*/
UPC_2INT,	/*	2*sizeof(int)	*/
UPC_SHORT_INT,	/*	<pre>sizeof(short)+sizeof(int)</pre>	*/
UPC_LONG_DOUBLE_INT	/*	<pre>sizeof(long double)+sizeof(int)</pre>	*/
3			

upccoll\_dtype\_t;

3

```
upccoll return t
                        (upccoll_dtype_t dt,
size_t * nbytes);
upccoll_type_size
```

### Description

1. In this section we list all pre-defined data types for collective communication. As already mentioned in Section 2.6, this version of the collective specification does not address user defined types.

# 3.1.6 Error codes

### Synopsis

```
typedef enum {
  UPCCOLL_SUCCESS=0,
                          /* no error
                                                              */
                                                              */
*/
  UPCCOLL_ERROR,
                          /*
                            generic error
 UPCCOLL ERROR TEAM.
                          /*
                            invalid team handle
                                                              .
*/
  UPCCOLL_ERROR_SIZE,
                            invalid team size
  UPCCOLL_ERROR_RANK,
                                                              */
                          /* invalid team rank
  UPCCOLL_ERROR_HANDLE,
                         /* invalid collective handle
  UPCCOLL_ERROR_SENDBUF,
                         /* invalid send buffer (e.g. NULL)
                                                              */
 UPCCOLL_ERROR_RECVBUF, /* invalid recv buffer (e.g. NULL)
                                                              */
  UPCCOLL_ERROR_COUNT,
                         /* invalid data count (e.g. 0)
                                                              */
 UPCCOLL_ERROR_DATATYPE, /* invalid data type specified
                                                              */
  UPCCOLL_ERROR_UPC_OP,
                         /* invalid UPC operation specified */
  UPCCOLL_ERROR_FLAGS,
                         /* invalid combination of op. flags*/
 UPCCOLL_ERROR_ROOT,
                         /* invalid root in e.g. broadcast
                                                              */
 UPCCOLL_ERROR_SENDTYPE,/* invalid send data type
 UPCCOLL_ERROR_RECVTYPE, /* invalid receive data type
                                                              */
  UPCCOLL_ERROR_SENDCNTS,/* invalid send data count
                                                              */
  UPCCOLL_ERROR_RECVCNTS, /* invalid receive data count
                                                              */
  UPCCOLL_ERROR_SDISPLS, /* invalid send displacements
  UPCCOLL_ERROR_RDISPLS, /* invalid receive displacements
                                                              */
 UPCCOLL_ERROR_MALLOC, /* failure in malloc()
                                                              */
 UPCCOLL_ERROR_UNINITIALIZED /* un-initializeded parameter */
```

upccoll\_return\_t;

### Description

- 1. Error codes are returned by every function in our library. We expect a 0 return code to signify success and anything non-zero to signal a failure of some sort.
- 2. Advice to implementors: We supply these error codes as suggestions. Library implementors are not obliged to define or implement anything beyond UPCCOLL\_SUCCESS and UPCCOLL\_ERROR.

# 3.2 Initialization and termination functions

### Synopsis

upccoll\_return\_t upccoll\_initialize (int \*argc, char \*\*\*argv); upccoll\_return\_t upccoll\_finalize ();

### Description

- 1. The initialization function works in a manner similar to MPI\_Init in the MPI library. No UPC Collectives 2.0 functions should be called before initialization.
- 2. The initializer is allowed to change the contents of the **argv** array presented to it, removing options it interprets as addressed to the UPC Collectives 2.0 library.
- 3. The finalize function has barrier semantics. All UPC Collectives 2.0 operations are considered terminated upon return from this call. No UPC Collectives 2.0 functions should be invoked after the return of the finalize function.

# 3.3 Completion management for non-blocking collectives

### Synopsis

```
int upccoll_test (upccoll_handle_t h);
void upccoll_wait (upccoll_handle_t h);
void upccoll_fence (void);
```

### Description

- 1. As described in Section 2.3, there are three ways to ensure completion of a UPC Collectives 2.0 function call.
- 2. If the UPC\_ASYNC\_FENCE flag (see Section 3.1.2) is specified in a UPC Collectives 2.0 call then the call is considered to be non-blocking and will return immediately. Waiting for the call is not necessary; it will complete upon the next invocation of upccoll\_fence or upccoll\_finalize.
- 3. Existing UPC synchronization functions like upc\_barrier and upc\_fence have no effect on the completion of UPC\_ASYNC\_FENCE calls. This is in line with our stated principle that we are not altering the semantics of the existing UPC functions.
- 4. All UPC Collectives 2.0 calls have an out-parameter called handle. If UPC\_ASYNC\_FENCE is not set and the pointer supplied to hold the handle is NULL, then the collective call is considered blocking and will be complete upon return.
- 5. Finally, if UPC\_ASYNC\_FENCE is not set and the user supplies a valid pointer to hold handle, the collective call is considered non-blocking and will return a valid handle in that pointer. This operation will not complete until the handle is waited on with upccoll\_wait.
- upccoll\_wait blocks until the operation represented by a handle is complete. Non-blocking operations with valid handles must be waited on by upccoll\_wait.
- 7. upccoll\_test can be used to check whether an operation is complete, in a non-blocking manner. However, upccoll\_test is not a replacement for upccoll\_wait. The operation cannot be considered complete until the latter function is called.
- 8. upccoll\_wait performs the same service for UPC Collectives 2.0 as upc\_wait does for the standard UPC barrier. Our library approach prohibits us from modifying existing UPC functionality, hence the new name.

# 3.4 Team operations

1. A UPC team is an ordered collection of unique UPC threads. A team of size  $N \leq$  THREADS can be thought of as a one-to-one mapping team :  $0..(N - 1) \rightarrow 0..(THREADS - 1)$ 

2. Teams are created and destroyed by UPC functions described in this section. These functions are similar to MPI communicator management functions. As described in Section 2.1, team creation and destruction functions have collective semantics. In our API teams are identified by *team handles*, an opaque object defined as follows:

typedef void\* upccoll\_team\_t;

- 3. Team handles have local semantics only. That is, team IDs should not be stored in shared variables and used across processors. Doing so will result in unpredictable system behavior.
- 4. Advice to implementors: the API is compatible with team handles being local pointers to team objects. There is no guarantee that team objects have the same addresses across different UPC threads.
- 5. **Default team:** Every collective function call in our library has a team handle argument. The constant value UPC\_TEAM\_ALL can be used in any of these function calls; UPC\_TEAM\_ALL means all UPC threads will participate in the collective.
- 6. Advice to implementors: UPC\_TEAM\_ALL might be implemented as a constant value or a macro with value NULL.

# 3.4.1 The upccoll\_team\_rank function

### Synopsis

upccoll\_return\_t upccoll\_team\_rank (upccoll\_team\_t team, int \*rank);

### Description

- 1. The upccoll\_team\_rank function returns the calling thread's rank in a team, a value between 0 and N-1 for a team of size N.
- 2. Since team handles are always local, it follows that only members of a team can query their rank. Different members of a team cannot have the same rank.
- 3. The value returned by upccoll\_team\_rank when UPC\_TEAM\_ALL is queried is the same as MYTHREAD.

# 3.4.2 The upccoll\_team\_size function

### Synopsis

upccoll\_return\_t upccoll\_team\_size (upccoll\_team\_t team, int \*size);

### Description

1. The upccoll\_team\_size function returns the size of a team (the number of UPC threads in the team). This will always be a value between 1 and THREADS, and always be THREADS for the default team UPC\_TEAM\_ALL. Every team has to have at least one member. All threads in a team will get back the same value for team size.

# 3.4.3 The upccoll\_team\_split function

### Synopsis

upccoll_return_t upccoll_team_spl	Lit (upccoll_team_t	team,
	int	color,
	int	key,
	upccoll_team_t	* newteam)

### Description

- 1. Create a set of mutually disjoint new teams from the parent team. This is a collective function, called by every thread in the team.
- 2. As many new teams are created as the number of distinct color identifiers submitted by all threads. Each thread will belong to the team specified by the color argument and will have thread ID key in that team.
- 3. Two participating threads in the call cannot specify the same key and color combination (this leads to undefined behavior).
- 4. For each newly created team, all keys from 0 to size(team)-1 have to be covered by exactly one participant. Failure to do so will result in dysfunctional teams, i.e. undefined behavior when collectives are called on the broken teams.
- 5. The team handle returned by the operation is a strictly local object. It should not be copied into a shared object and dereferenced by any thread other than the one it was created for.

# 3.4.4 The upccoll\_team\_free function

### Synopsis

void upccoll\_team\_free (upccoll\_team\_t team);

### Description

 Free the argument team. The function has collective barrier semantics (that is, has to be invoked by every thread in the team at the same time). After the call the team handle cannot be used anymore for any purpose.

#### 3.5 **Collective functions**

In this section we describe the proposed API for the collective calls themselves. We first enumerate rules that govern all collective calls.

- 1. In collectives with a root argument, all participating threads have to agree on the identity of the root.
- 2. Data buffer lengths: In all collectives the participating threads have to pairwise agree on the size of exchanged data; failure to agree on will cause upredictable results. As in MPI, the size of a buffer is defined as the size associated with the UPC data type of the buffer multiplied by the element count.
- 3. Collective flags are as described in Section 3.1.2. These flags govern buffer ownership rules and collective termination.
- 4. Fence semantics: Collective calls' fence semantics is determined by the flags used in the call, consistent with Section B.3.2.2 in the UPC Specification V1.2.
- 5. Start and completion order of overlapping collectives is governed by the rules laid down in Section 2.5.
- 6. Overlapping send and receive buffers can yield unpredictable results. The implementation is not required to allocate additional buffer space for holding intermediate results.
- 7. Return codes are detailed in Section 3.1.6.

#### 3.5.1 The upccoll\_barrier function

### Synopsis

team. upccoll\_return\_t upccoll\_barrier (upccoll\_team\_t upccoll\_flag\_t flags upccoll handle t \* handle):

### Description

- 1. This is a barrier function on the UPC team called team.
- 2. Buffer ownership flags will be ignored, as there are no buffers to exchange.
- 3. In the non-blocking form of this operation the barrier is complete on any one thread as soon as *every* thread in the team has entered the barrier.

# 3.5.2 The upccoll\_bcast function

### Synopsis

```
upccoll_return_t
upccoll_bcast (shared void
                                  * sendbuf.
                                    sendcount.
               size t
               upccoll_dtype_t
                                    sendtype,
               shared void
                                   recvbuf,
               size_t
                                    recvcount
               upccoll_dtype_t
                                    recvtype,
                int
                                    root.
               upccoll_team_t
                                    team.
               upccoll_flag_t
                                    flags
                upccoll_handle_t
                                   handle);
```

### Description

- 1. This is a broadcast function. (sendcount\*size(sendtype) bytes of the send buffer (sendbuf) are copied from the *root* UPC thread to all the threads, including itself.
- 2. The sendbuf, sendcount and sendtype values are ignored by all but the root thread.
- 3. Every thread (including the root thread) is required to specify the receive buffer **recvbuf**. Every thread receives *size*(recvtype) \* recvcnt bytes.

# 3.5.3 The upccoll\_scatter function

### Synopsis

upccoll_return_t	;		
upccoll_scatter	(shared void size_t upccoll_dtype_t shared void size_t upccoll_dtype_t int upccoll team t	*	<pre>sendbuf, sendcnt, sendtype, recvbuf, recvcnt, recvtype, root, team.</pre>
	upccoll_flag_t	*	flags, handle):
	ubccorr_nanare_c		nanare),

### Description

- 1. This is a scatter function. Different parts of the buffer sendbuf specified by the root thread are copied to recvbuf buffers on each thread.
- 2. Specifically, for every thread  $t \in 0$ . |team| 1 in the participating team, *size*(sendtype)\*sendcnt bytes are copied from offset t\*size(sendtype)\*sendcnt of the send buffer to the receive buffer of the thread.
- 3. The sendbuf, sendcount and sendtype values are ignored by all but the root thread.
- 4. Every thread (including the root thread) receives size(recvtype) \* recvcnt bytes into the receive buffer recvbuf.

### 3.5.4 The upccoll\_scatterv function

### Synopsis

upccoll_return_t		
upccoll_scatterv	(shared	void
	size_t	
	size_t	

size_t	* sendcnts,
size_t	* sdispls,
upccoll_dtype_t	sendtype,
shared void	<pre>* recvbuf,</pre>
size_t	recvcnt,
upccoll_dtype_t	recvtype,
int	root,
upccoll_team_t	team,
upccoll_flag_t	flags,
upccoll_handle_t	<pre>* handle);</pre>

\* sendbuf,

### Description

- 1. This is a scatter function with variable buffer sizes. Portions of the buffer **sendbuf** specified by the **root** thread are copied to the **recvbuf** specified by all threads.
- Operational semantics are similar to upccoll\_scatter, except for the amount of data transferred to each participant. The root thread sends sendcnts[t]\*size(sendtype) bytes from address sendbuf + sdispls[t]\*size(sendtype) to each thread t ∈ 0..|team| - 1.
- 3. Every thread t receives size(recvtype) \* recvcnt bytes into the receive buffer recvbuf. This amount has to correspond to the sendcnts[t]\*size(sendtype) bytes sent by the root.

# 3.5.5 The upccoll\_gather function

### Synopsis

```
upccoll_return_t
upccoll_gather (shared void

    sendbuf.

                 size_t
                                        sendcnt,
                 upccoll_dtype_t
                                        sendtype,
                 shared void
                                      * recybuf.
                 size t
                                        recycnt.
                 upccoll_dtype_t
                                        recvtype,
                 int
                                        root,
                 upccoll_team_t
                                        team,
                 upccoll_flag_t
                                        flags
                 upccoll_handle_t
                                      * handle);
```

### Description

- 1. This is a gather function with fixed buffer sizes. The receive buffer **recvbuf** specified by the **root** thread receives a fixed number of bytes from each of the participating threads in the team (including itself).
- Data sent by thread t ∈ 0..|team|-1 is received at location recvbuf + t\*recvcnt\*size(recvtype) on the root thread.
- 3. On threads other than the root the arguments recvbuf, recvcnt and recvtype are ignored.

4. The number of bytes sent by every thread in the team is size(sendtype)\*sendcnt. This value must correspond to size(recvtype)\*recvcnt specified by the root thread.

# 3.5.6 The upccoll\_gatherv function

### Synopsis

pccoll_return_	t		
pccoll_gatherv	(shared void	*	sendbuf,
	size_t		sendcnt,
	upccoll_dtype_t		sendtype,
	shared void	*	recvbuf,
	size_t	*	recvcnts,
	size_t	*	rdispls,
	upccoll_dtype_t		recvtype,
	int		root,
	upccoll_team_t		team,
	upccoll_flag_t		flags,
	upccoll_handle_t	*	handle);

### Description

- 1. This is a gather function with variable buffer sizes. The receive buffer **recvbuf** specified by the **root** thread receives variable number of bytes from each of the participating threads (as specified by the **team** argument).
- Data sent by thread t ∈ 0..|team|-1 is received at offset rdispls[t]\*size(recvtype) in the receive buffer on the root thread.
- 3. On threads other than the root the arguments recvbuf, recvcnts, rdispls and recvtype are ignored.
- 4. The number of bytes sent by every thread t in the team is size(sendtype)\*sendcnt. This value must correspond to size(recvtype)\*recvcnt[t] specified by the root thread.

# 3.5.7 The upccoll\_allgather function

### Synopsis

pccoll_return_t			
pccoll_allgather	(shared void	*	sendbuf,
	size_t		sendcnt,
	upccoll_dtype_t		sendtype,
	shared void	*	recvbuf,
	size_t		recvcnt,
	upccoll_dtype_t		recvtype,
	upccoll_team_t		team,
	upccoll_flag_t		flags,
	upccoll handle t	*	handle):

### Description

1. This is an *allgather* (or all-broadcast) function with fixed buffer sizes. There is no designated root thread: every participant disseminates their send buffer sendbuf to every other participant.

- Data from thread t ∈ 0..|team|-1 arrives to offset recvcnt\*size(recvtype) in the receive buffer.
- 3. At the end of the collective the receive buffers on all threads are identical (hence "all-broadcast").

### 3.5.8 The upccoll\_allgatherv function

### Synopsis

```
upccoll_return_t
upccoll_allgatherv (shared void

    sendbuf,

                     size_t
                                            sendcnt,
                     upccoll_dtype_t
                                            sendtype
                     shared void
                                           recvbuf.
                     size_t

    recvcnts.

                     size t
                                          * displs,
                     upccoll_dtype_t
                                            recvtype,
                     upccoll_team_t
                                            team,
                     upccoll_flag_t
                                            flags
                                          * handle);
                     upccoll_handle_t
```

### Description

- 1. This is an **allgather** function with variable buffer sizes: the participants in the team broadcast variable amounts of data.
- 2. sendcnt\*size(sendtype) bytes are broadcast by each thread to every other thread.
- Data from thread t ∈ 0..|team|-1 arrives to offset rdispls[t]\*size(recvtype) in the receive buffer.
- 4. The number of bytes received from thread t is recvcnts[t]\*size(recvtype); this has to correspond to the number of bytes actually sent by thread t.
- 5. At the end of the collective the receive buffers on all threads are identical.

# 3.5.9 The upccoll\_alltoall function

### Synopsis

upccoll_return_t			
upccoll_alltoall	(shared void	*	sendbuf,
	size_t		sendcnt,
	upccoll_dtype_t		sendtype,
	shared void	*	recvbuf,
	size_t		recvcnt,
	upccoll_dtype_t		recvtype,
	upccoll_team_t		team,
	upccoll_flag_t		flags,
	upccoll_handle_t	*	handle);

### Description

 This is a personalized communication function with fixed buffer sizes. Every participating thread sends |team| buffers, one each to every thread in the team, and in turn receives buffers from the same threads. The buffers are all the same size.

- Data is sent to every thread t ∈ 0..|team| 1 from offset t\*sendcnt\*size(sendtype) of the send buffer sendbuf.
- Data received from thread t is deposited at offset t\*recvcnt\*size(recvtype) of the receive buffer recvbuf.

### 3.5.10 The upccoll\_alltoallv function

### Synopsis

u

u

pccoll_return_t			
pccoll_alltoallv	(shared void	*	sendbuf,
	size_t	*	sendcnts,
	size_t	*	sdispls,
	upccoll_dtype_t		sendtype,
	shared void	*	recvbuf,
	size_t	*	recvcnts,
	size_t	*	rdispls,
	upccoll_dtype_t		recvtype,
	upccoll_team_t		team,
	upccoll_flag_t		flags,
	upccoll_handle_t	*	handle);

### Description

- 1. This is a personalized communication function with variable buffer sizes. Its behavior is similar to that of alltoall but the sizes of the exchanged buffers vary.
- Data destined for thread t ∈ 0..|team|-1 is of size sendcnts[t]\*size(sendtype) and is sent from offset sdispls[t]\*size(sendtype) of the send buffer sendbuf.
- Data received from thread t is expected to be of size recvcnts[t]\*size(rectype) and is deposited at offset rdispls[t]\*size(recvtype) of the receive buffer recvbuf.

# 3.5.11 The upccoll\_reduce function

### Synopsis

pccoll_return_	t		
pccoll_reduce	(shared void	*	sendbuf,
	shared void	*	recvbuf,
	size_t		count,
	upccoll_dtype_t		dt,
	upccoll_op_t		op,
	int		root,
	upccoll_team_t		team,
	upccoll_flag_t		flags,
	upccoll_handle_t	*	handle);

### Description

- 1. This is a reduction function with results accumulated in the receive buffer of the root thread  $({root \in 0..|team|-1}).$
- Every participant provides count data items of size *size(dt)* bytes each in the send buffer sendbuf. The operation op is executed on every data element across all participants.

- 3. Results are available in the receive buffer recvbuf provided by the root thread. recvbuf is disregarded by all other threads.
- 4. All participant threads have to agree on the count, dt and op arguments, or else the outcome of the collective function is undefined.

# 3.5.12 The upccoll\_allreduce function

### Synopsis

```
upccoll_return_t
upccoll_allreduce (shared void
                                      * sendbuf.
                    shared void
                                      * recvbuf.
                    size_t
                                        count,
                    upccoll_dtype_t
                                        dt.
                    upccoll_op_t
                                        op,
                    upccoll_team_t
                                        team,
                    upccoll_flag_t
                                        flags
                    upccoll_handle_t * handle):
```

### Description

- 1. This is a reduction function with results distributed to every participant.
- 2. Every participant provides count data items of size *size*(dt) bytes each in the send buffer **sendbuf**. The operation op is executed on every data element across all participants.
- 3. Results are copied to the receive buffers recvbuf of every thread.
- 4. All participant threads have to agree on the count, dt and op arguments, or else the outcome of the collective function is undefined.

#### The upccoll\_reduce\_scatter func-3.5.13 tion

### Synopsis

upccoll_return_t			
upccoll_reduce_scatter	(shared void	*	sendbuf,
	shared void	*	recvbuf,
	size_t	*	recvcounts,
	upccoll_dtype_t		dt,
	upccoll_op_t		op,
	upccoll_team_t		team,
	upccoll_flag_t		flags,
	upccoll_handle_t	*	handle);

### Description

- 1. This is a reduction function with results distributed across the threads.
- 2. Every participant provides  $\sum_{t=0}^{|team|-1} recvcounts[t]$ data items of size *size*(dt) bytes each in the send buffer sendbuf. The operation op is executed on every data element across all participants.

- 3. Results are distributed in sequence across the receive buffers recvbuf provided by all threads, according to the recvcounts argument. Thread { $t \in$ 0..|team| - 1} receives recvcounts[t]\*size(dt) bytes of the end result.
- 4. All participant threads have to agree on the dt, op and tt recvcounts arguments, or else the outcome of the collective function is undefined.

# 3.5.14 The upccoll\_scan function

# Synopsis

upccoll_return_t						
upccoll_scan	(shared void	*	sendbuf,			
	shared void	*	recvbuf,			
	size_t		count,			
	upccoll_dtype_t		dt,			
	upccoll_op_t		op,			
	upccoll_team_t		team,			
	upccoll_flag_t		flags,			
	upccoll_handle_t	*	handle);			

### Description

- 1. This is a parallel scan (partial reduction) operation: for a given operator  $\bigoplus$  determined by the value of op, and contributions  $\mathtt{sendbuft}[i], t \in \mathtt{0..}|\mathtt{team}|-\mathtt{1}\}, i \in \mathtt{0..count}-\mathtt{1},$ the result on thread l is  $\texttt{result}_1[\texttt{i}] = \bigoplus_{\texttt{k}=0}^{\texttt{i}-1}\texttt{sendbuf}_{\texttt{k}}[\texttt{i}], \texttt{i} \in \texttt{0..count}-\texttt{1}.$
- 2. Every participant provides count data items of size *size*(dt) bytes each in the send buffer sendbuf. Results are copied to the receive buffers recvbuf of every thread.
- 3. All participant threads have to agree on the count, dt and op arguments, or else the outcome of the collective function is undefined.

#### 4. **CONCLUSION AND FUTURE WORK**

The proposed UPC collectives API described in this paper is by its very nature somewhat of a compromise. Our purpose is to introduce a vision of collective communication to the UPC community. We do not claim our approach to be comprehensive. We have picked the collective operations we consider most important and useful to actual users and lay a groundwork that is reasonably self-contained and open to future expansion. We have self-consciously abstained from a number of features (Section 2.6).

Our hope is that our work may form the kernel of a broad consensus. However, the most important goal is to move the collectives standard in the right direction, whether by our own efforts or someone else's.

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