

**Partial Globalization of Partitioned  
Address Spaces for Zero-copy  
Communication with Shared Memory**

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# Motivation

- Increasing popularity and availability of many-cores
- Abundance of legacy MPI code
- Simplifying programming model
  - single model, instead of hybrid
- Leveraging shared memory fully for performance
- Proving that shared memory could be used as an optimization for communication



# Partitioned Address Space Programming on Shared Memory

- Avoids having to worry about race conditions
- Encourages programmers to think about locality
- Could make it easier to reason about program correctness
  - if done at the right level of abstraction

Needs special handling to compete in performance with threaded shared memory programs



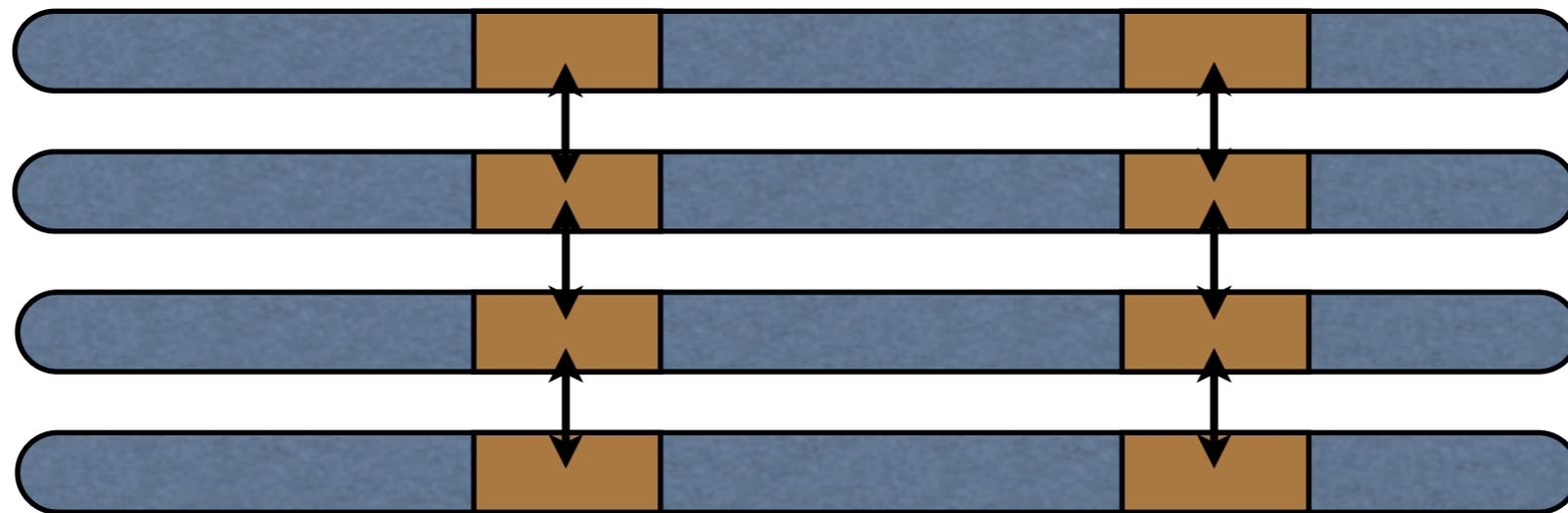
# Declarative Approach

- Originally motivated by Block-synchronous Parallel (BSP) programs, especially for collective communication
  - alternate between computation and communication
  - communication optimization breaks the structure



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    - alternate between computation and communication
    - communication optimization breaks the structure
- 
- The diagram consists of four horizontal bars stacked vertically. Each bar is primarily brown with a blue semi-circular cap on the left end and a blue semi-circular tail on the right end. The bars are of equal length and are positioned below the second bullet point of the first list item.
- Extend to non BSP-style applications

# Kanor for Clusters

*@communicate { b@recv\_rank <<= a@send\_rank }*

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↓  
Source-level compiler (using ROSE)

↓  
standard C++ code

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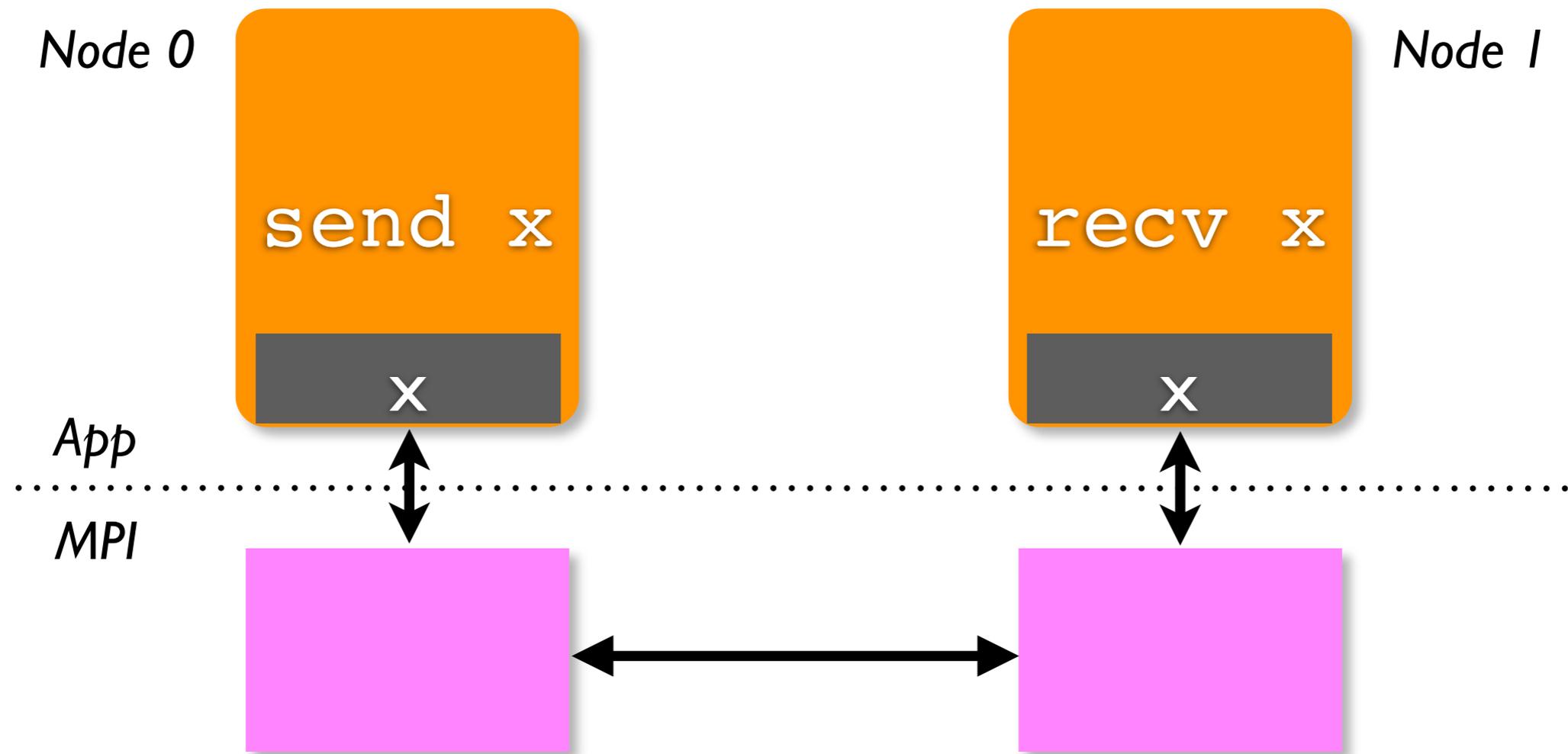
# Design Principles

- Users must think in parallel (creativity)
  - but not be encumbered with optimizations that can be automated, or proving synchronization correctness
- Compiler focuses on what it can do (mechanics)
  - not creative tasks, such as determining data distributions, or creating new parallel algorithms
- Incremental deployment
  - not a new programming language
  - more of a *coordination language* (DSL)
- Formal semantics
  - provable correctness



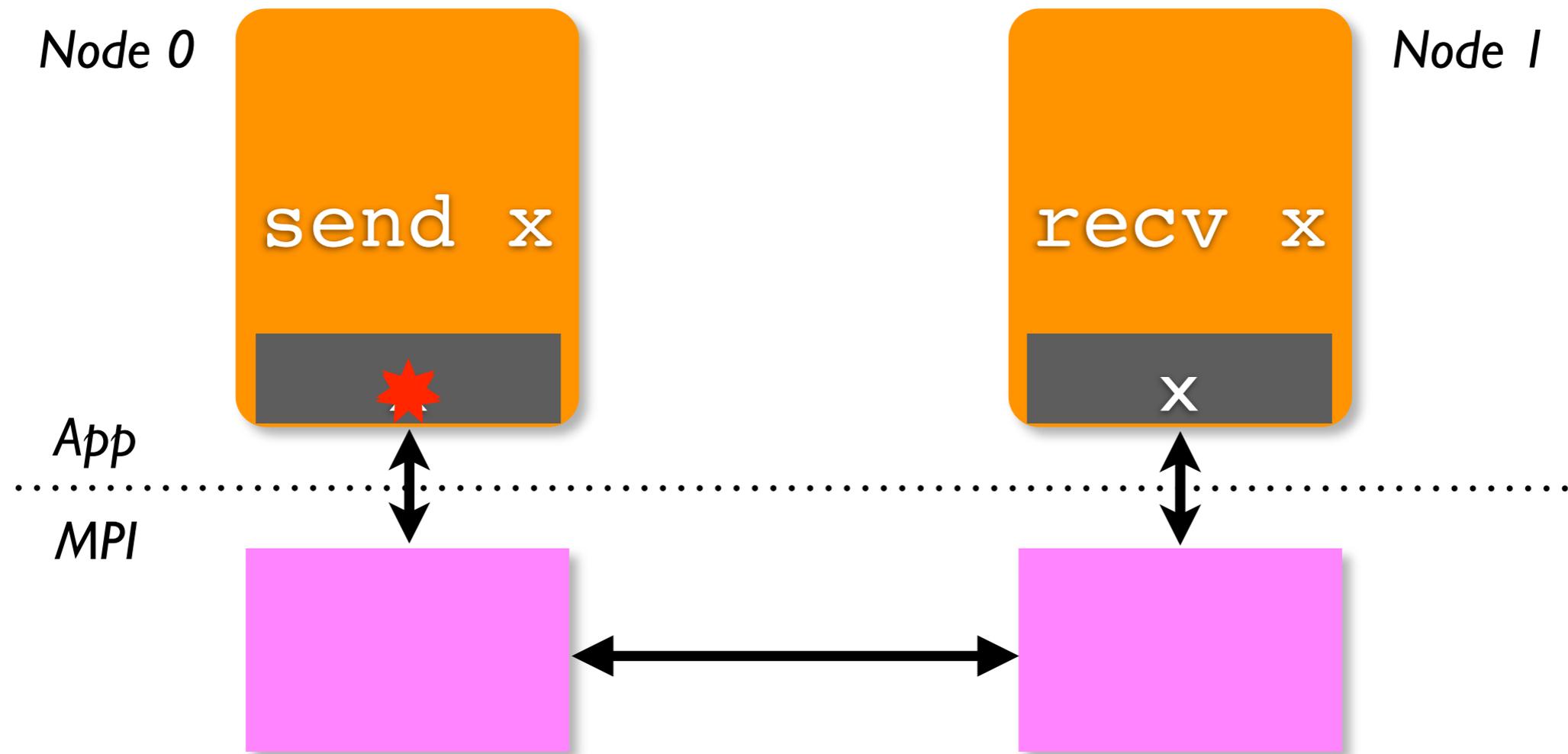
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@communicate {x@1 <<= x@0}
```



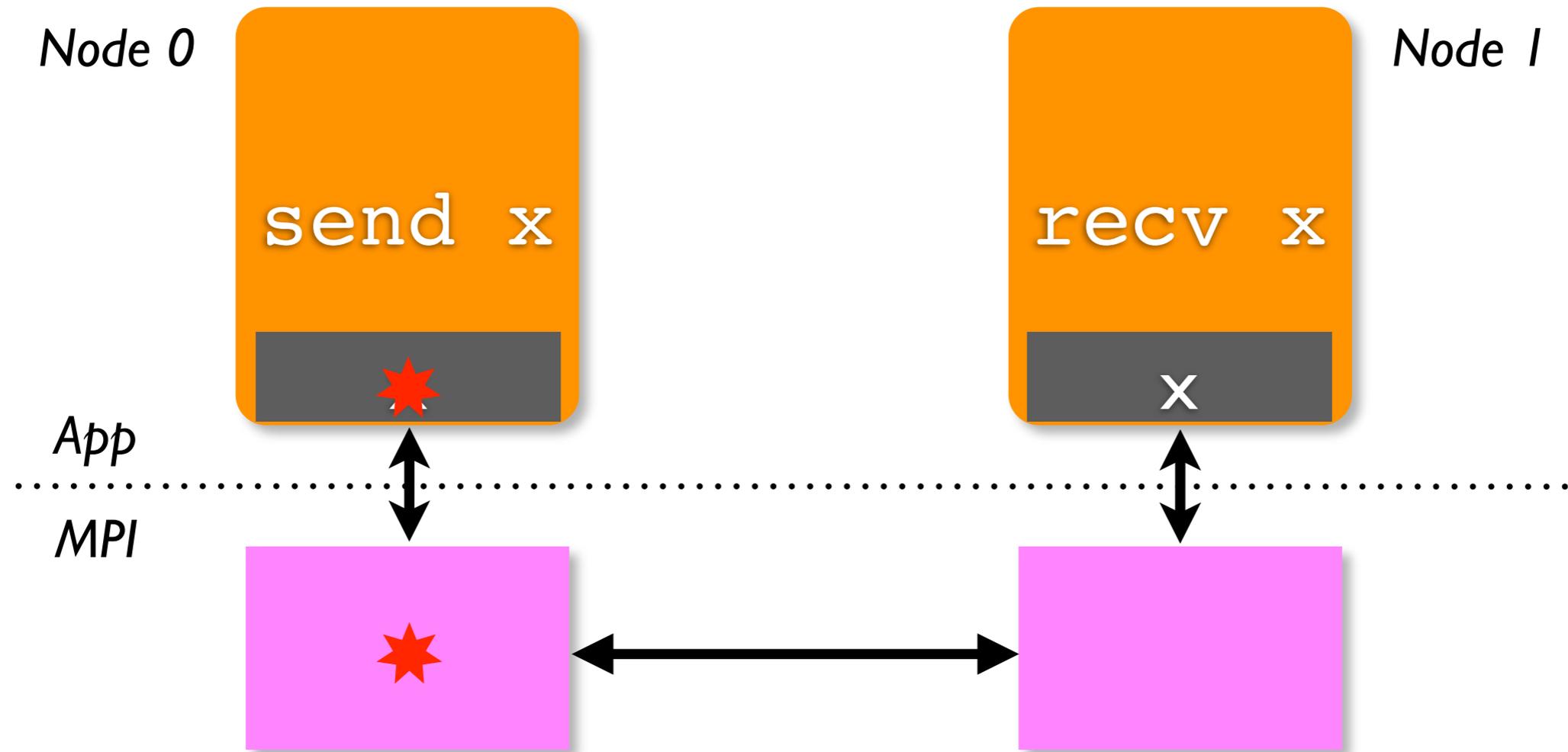
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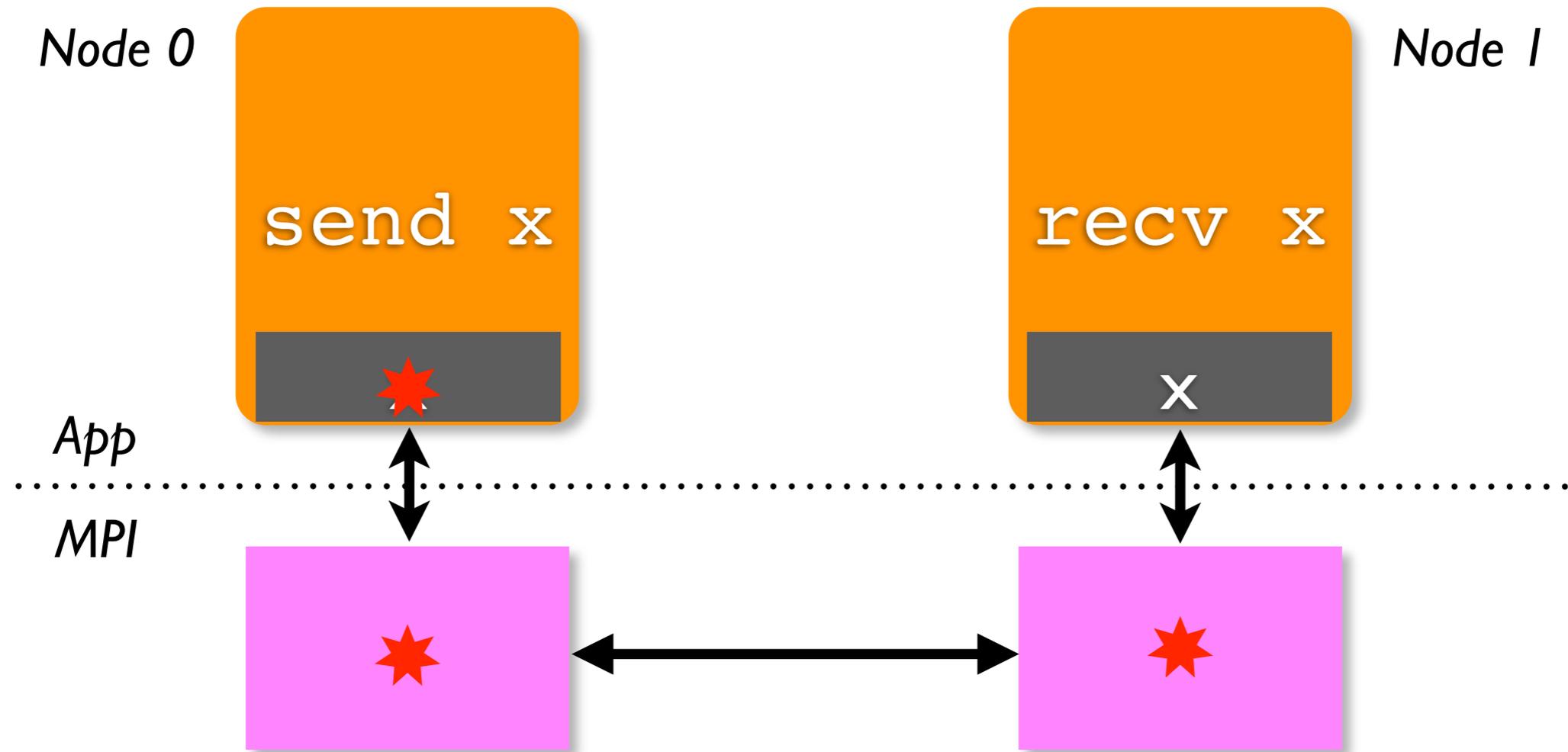
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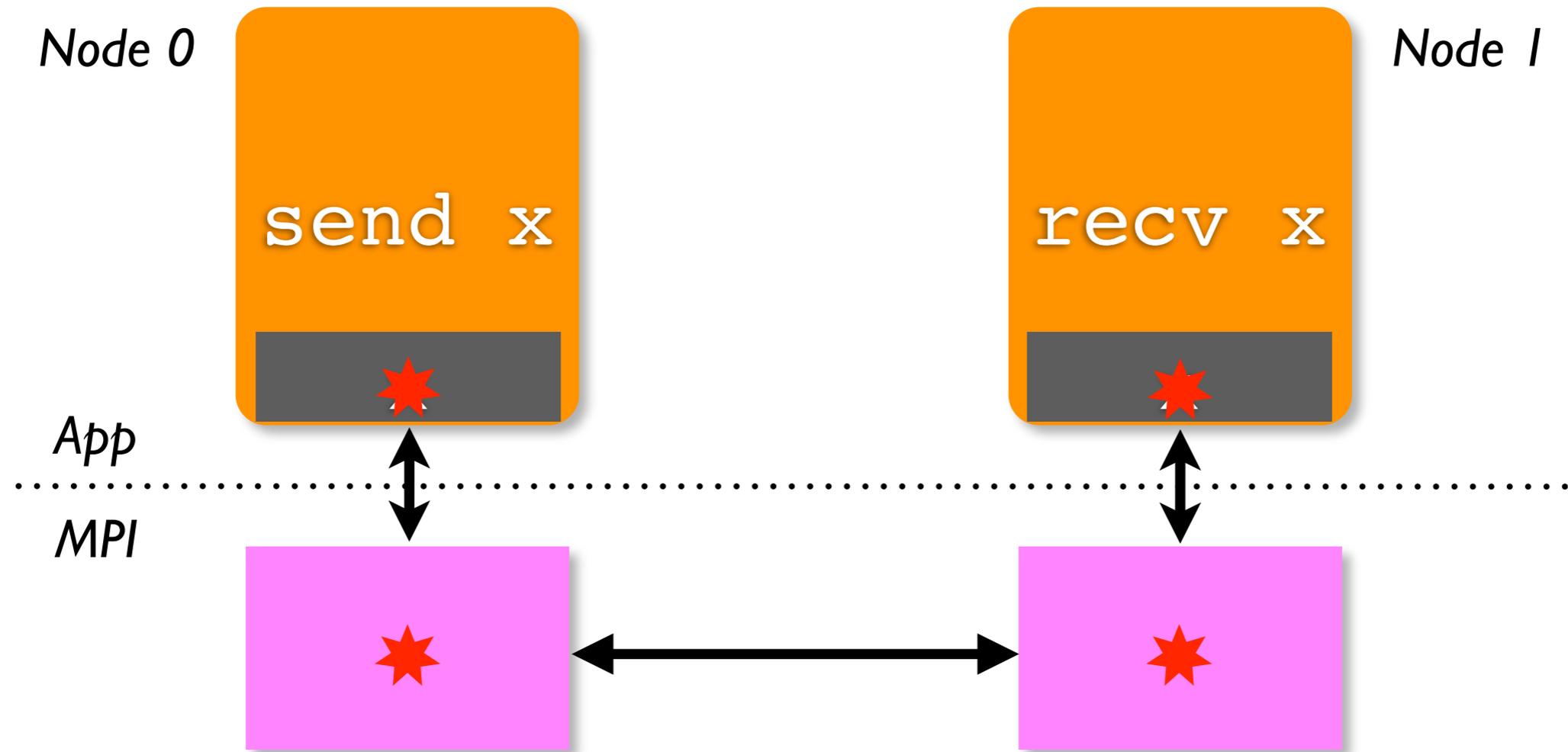
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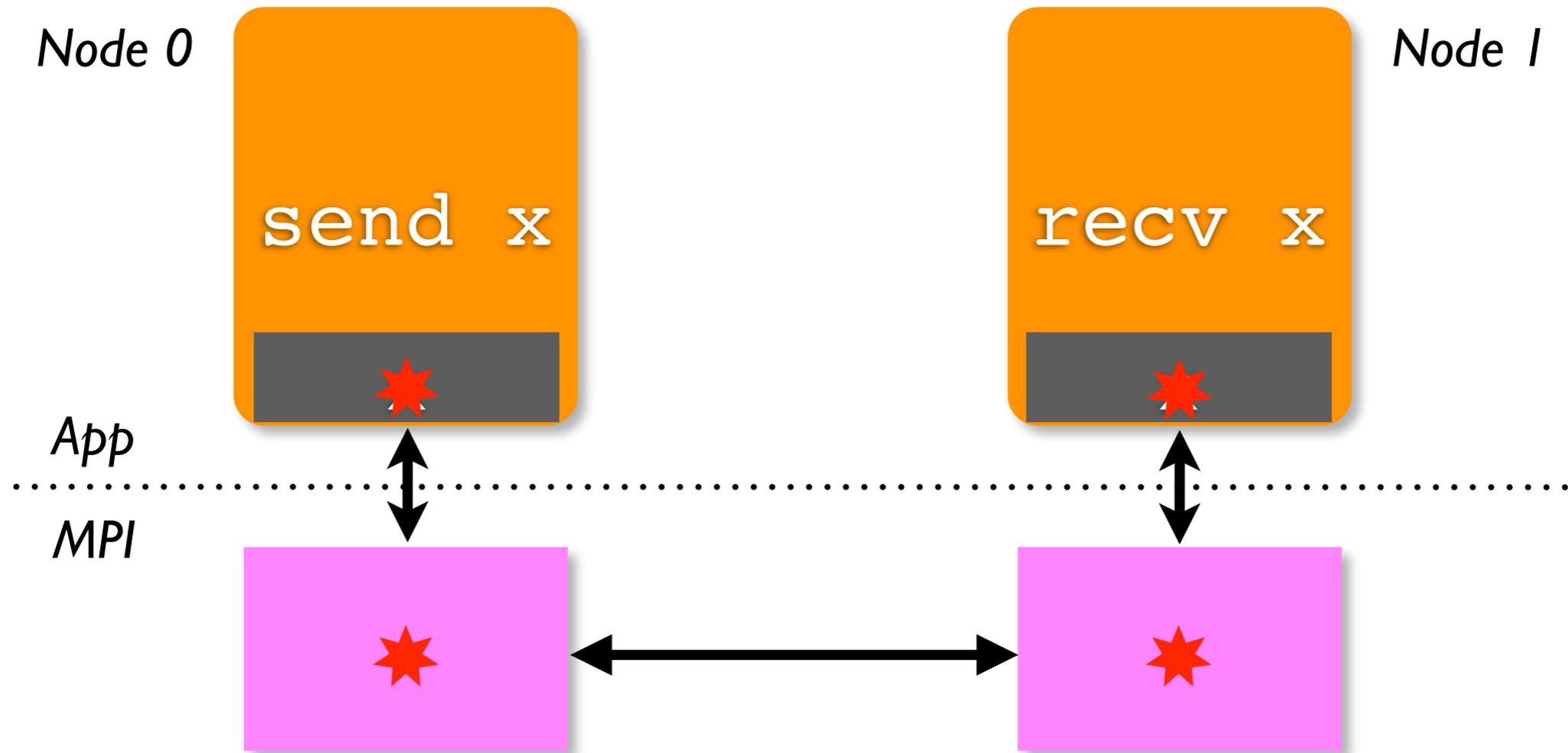
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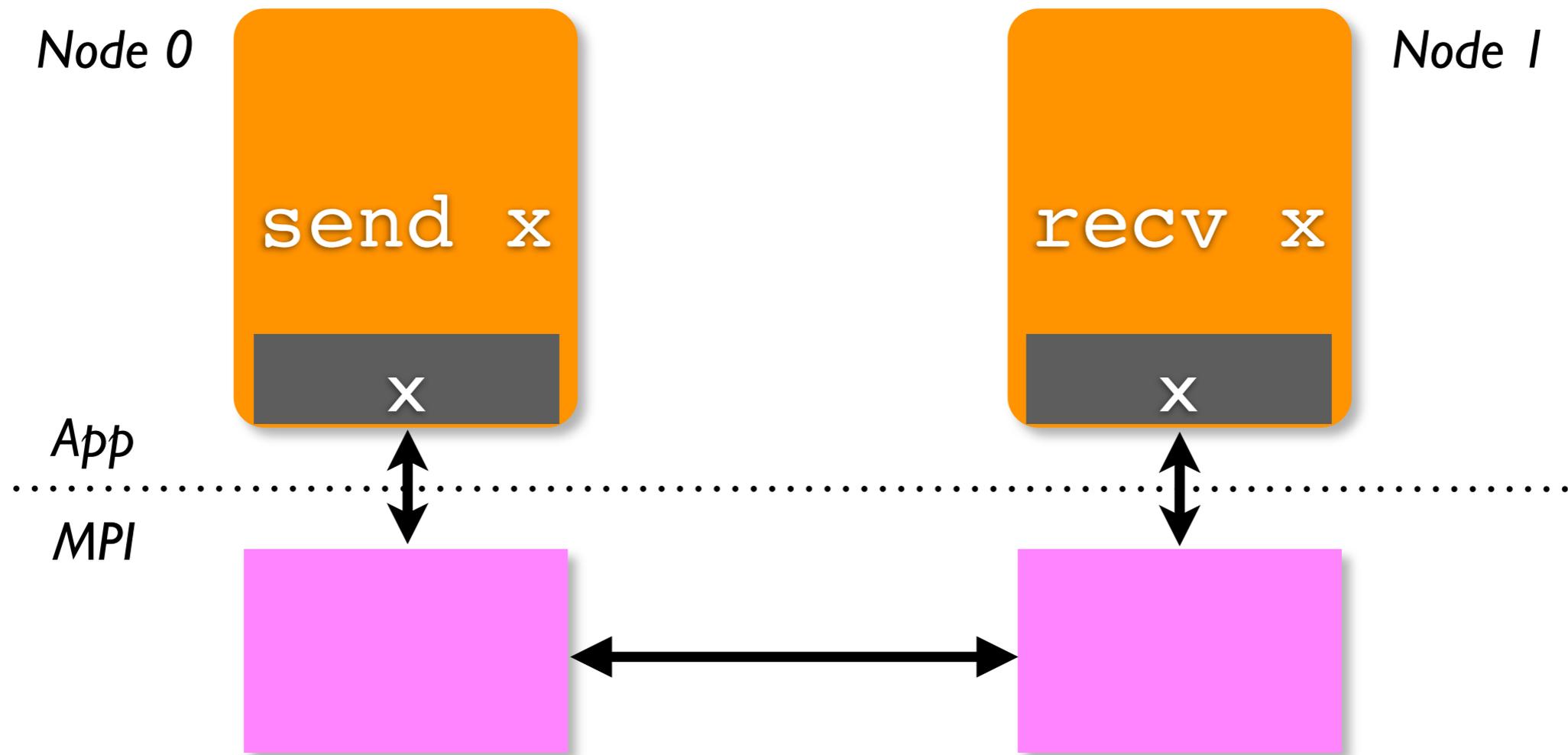
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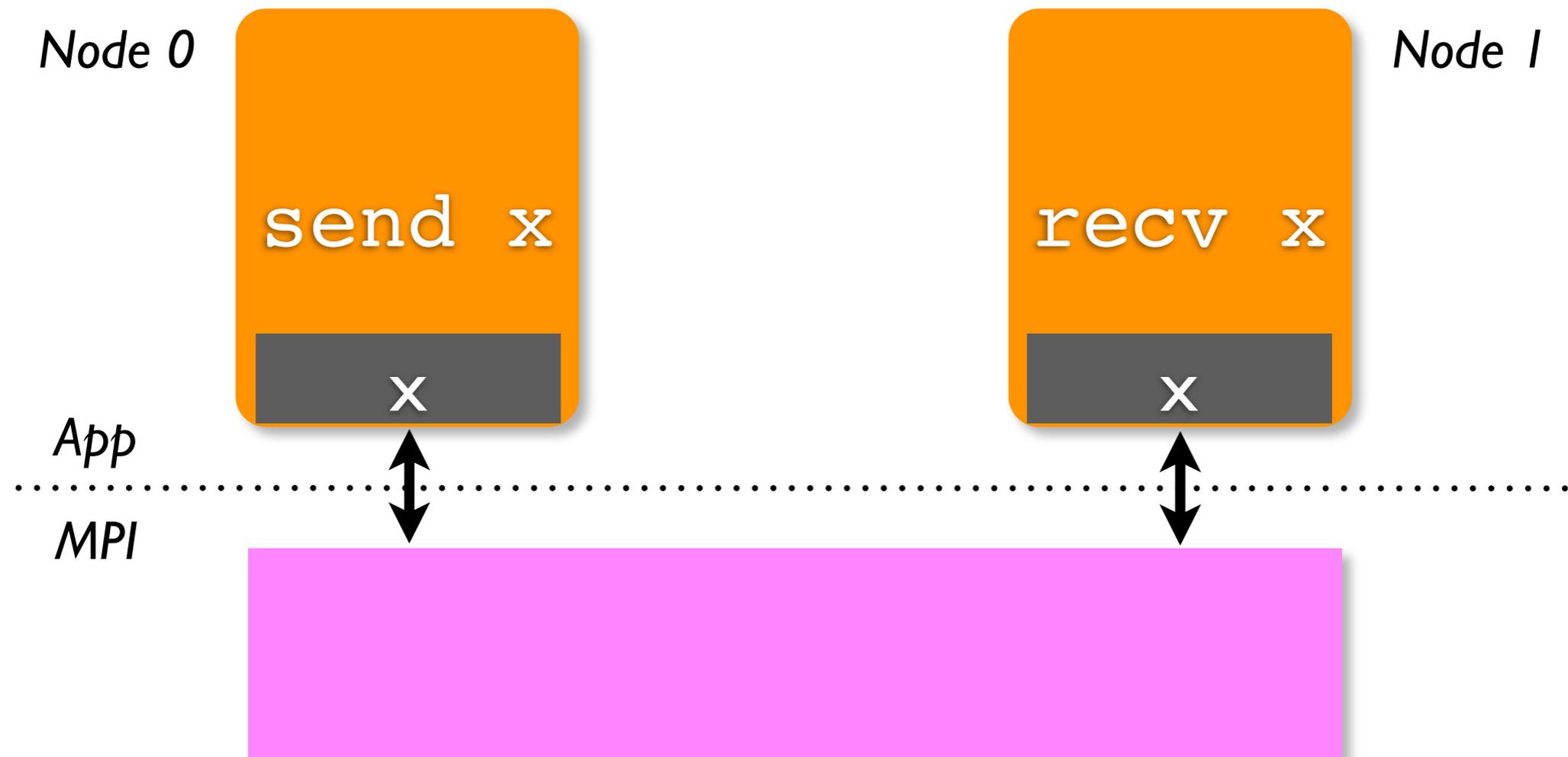
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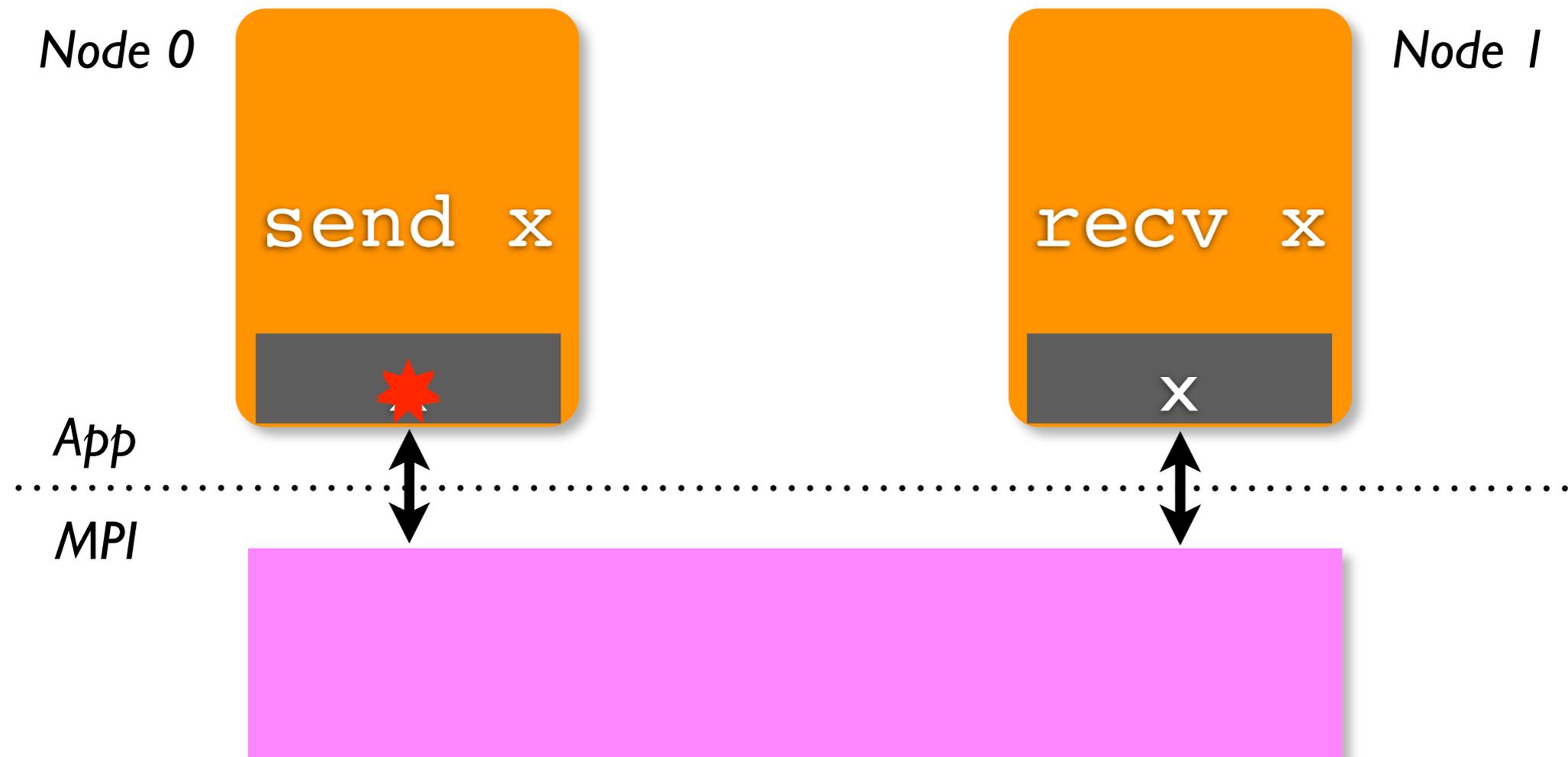
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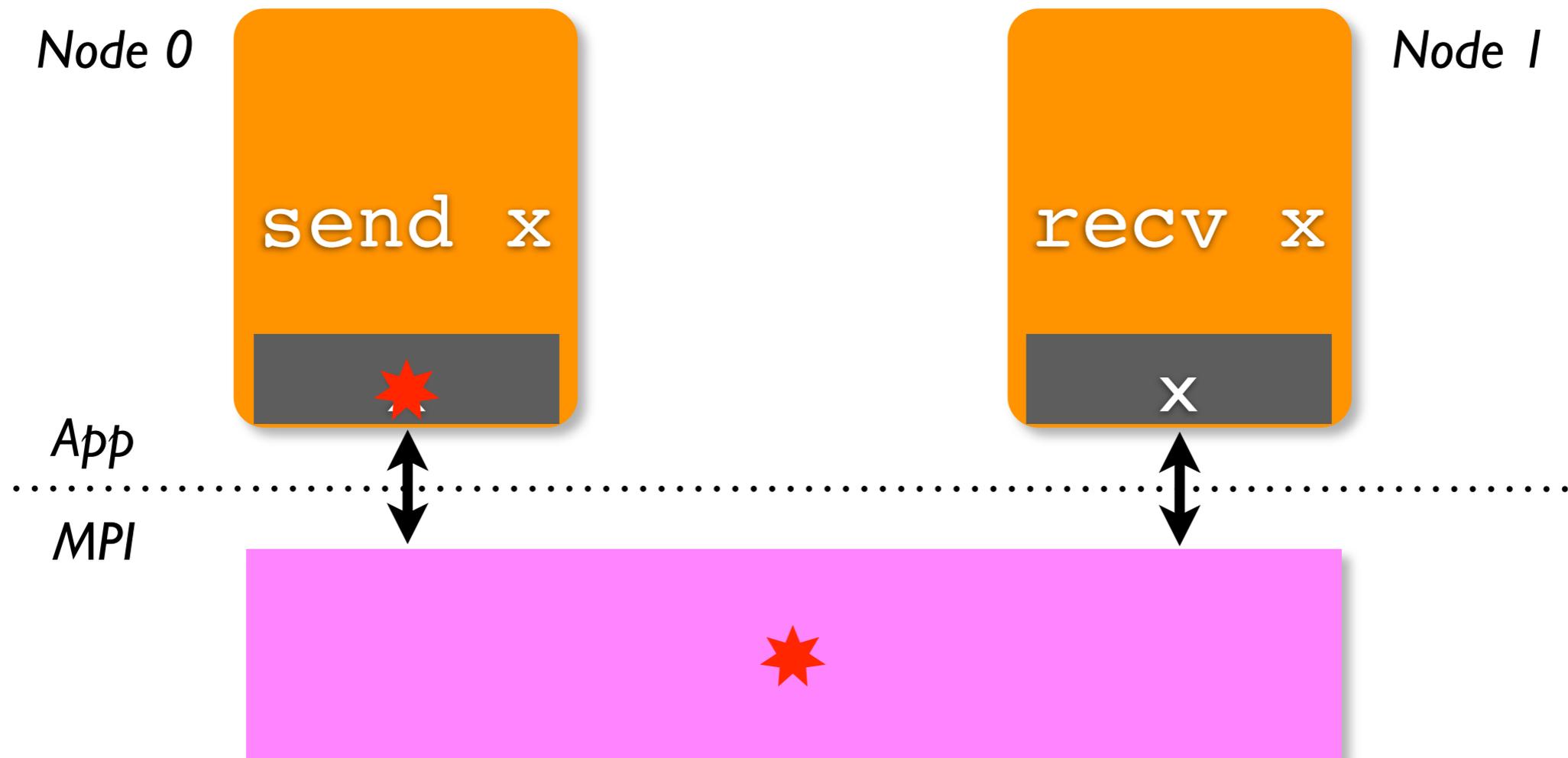
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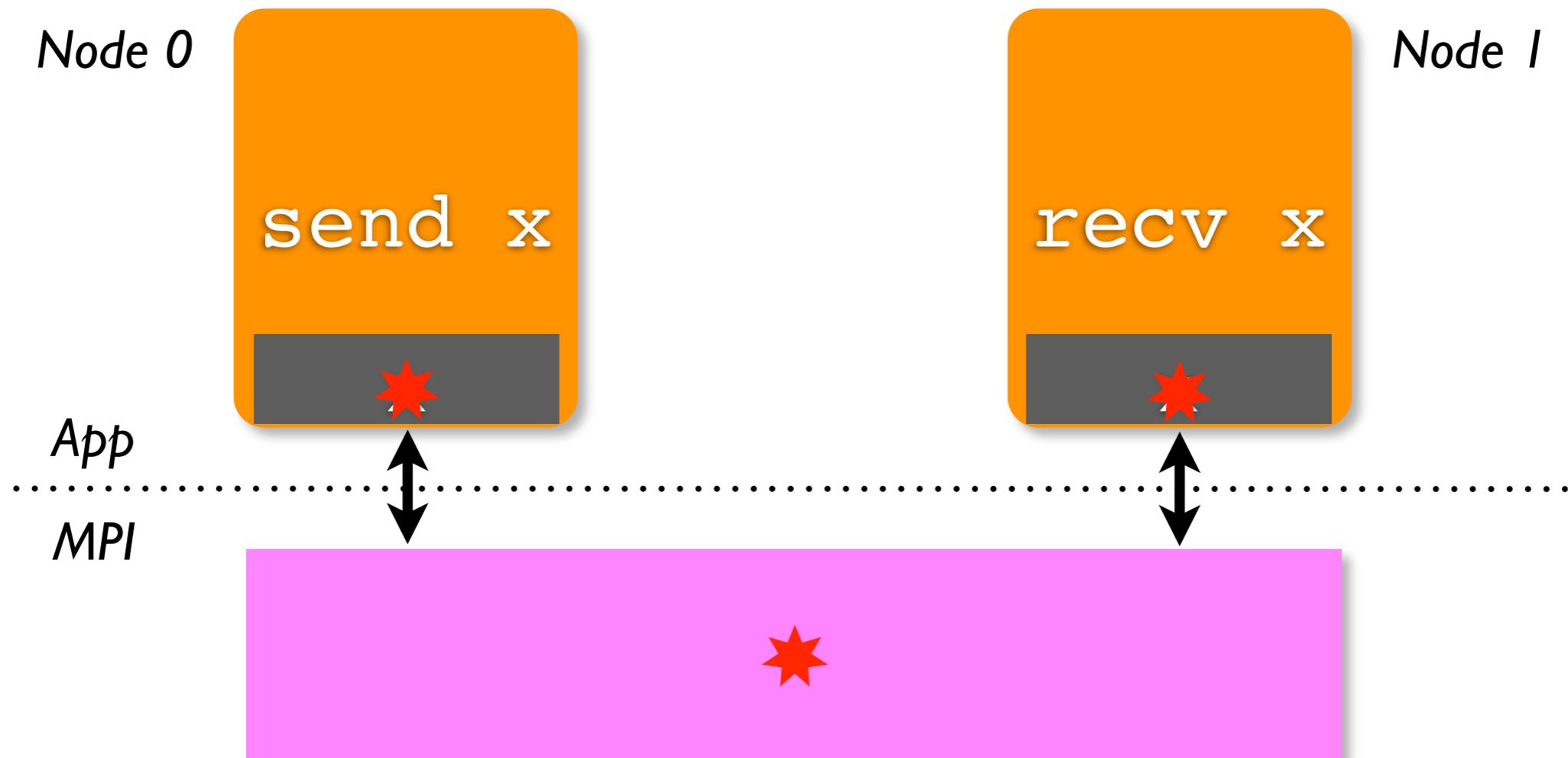
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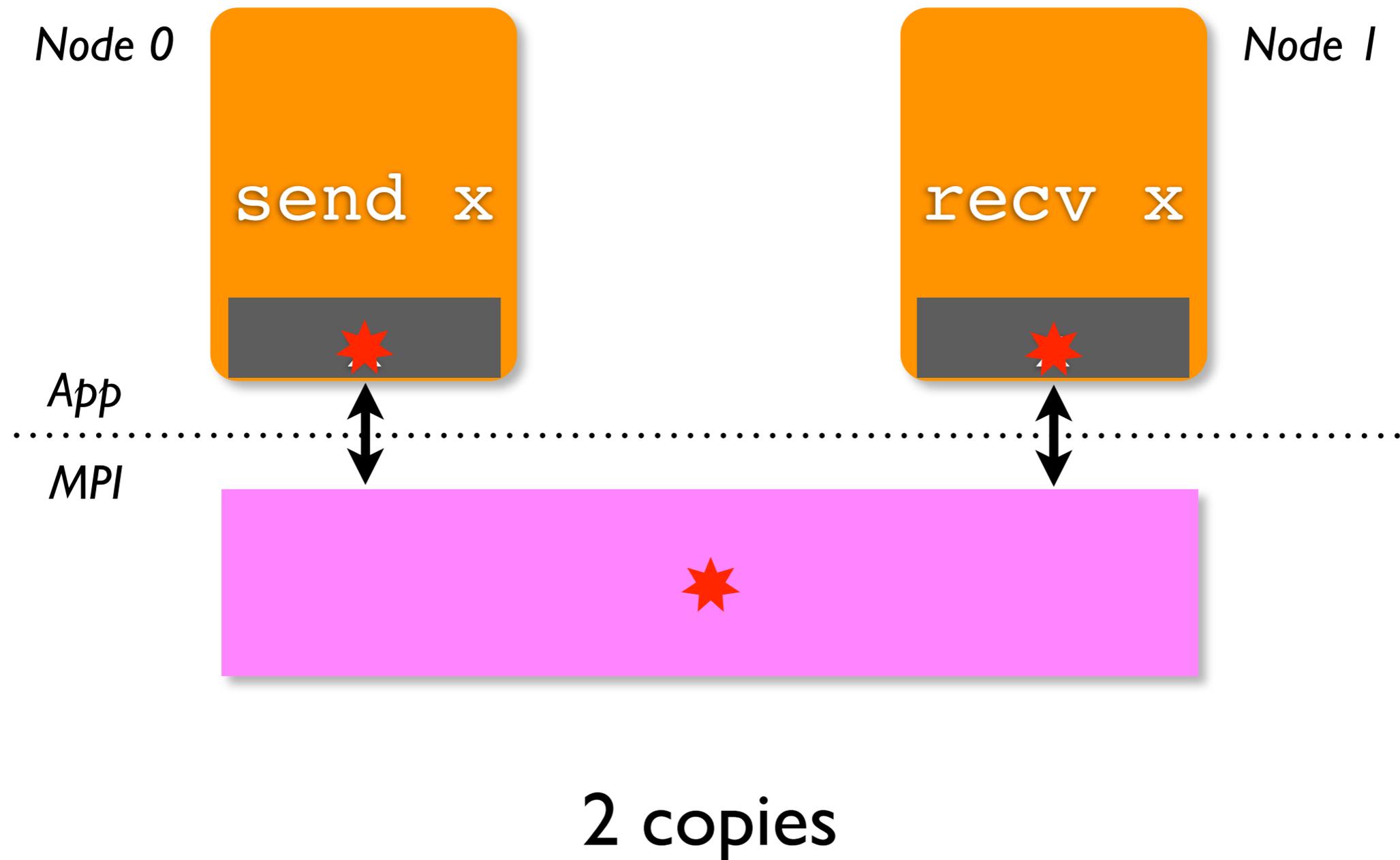
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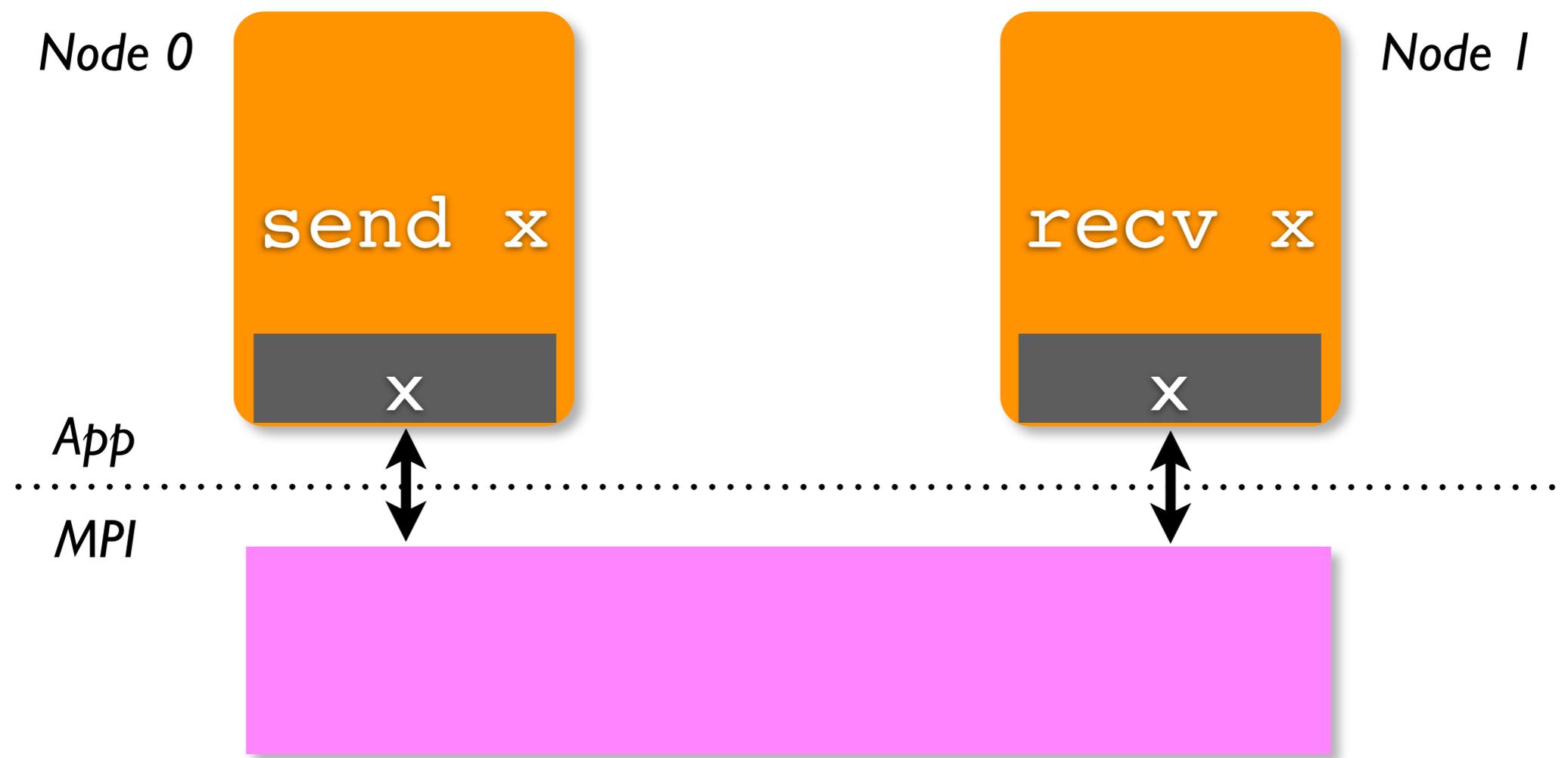
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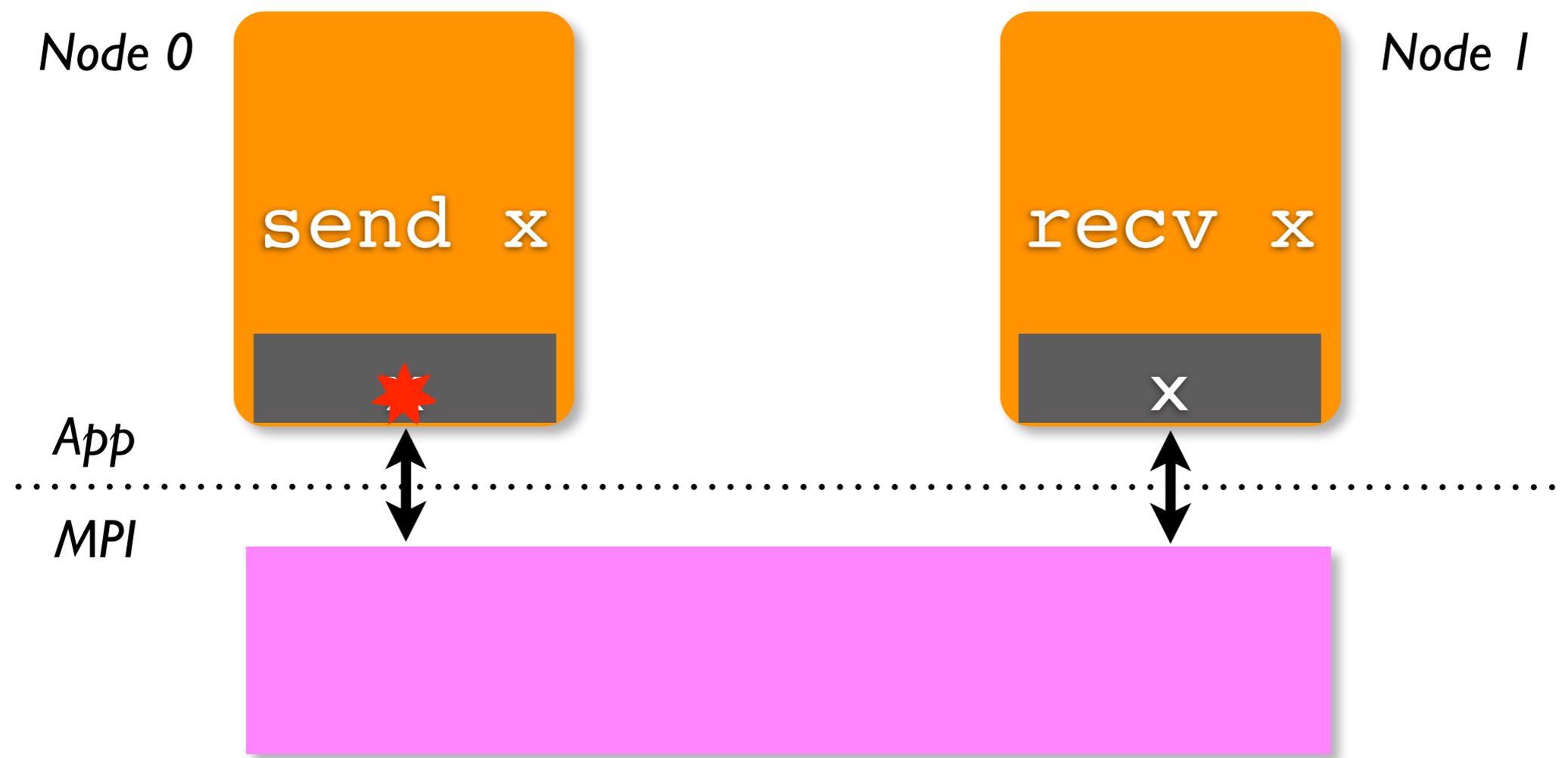
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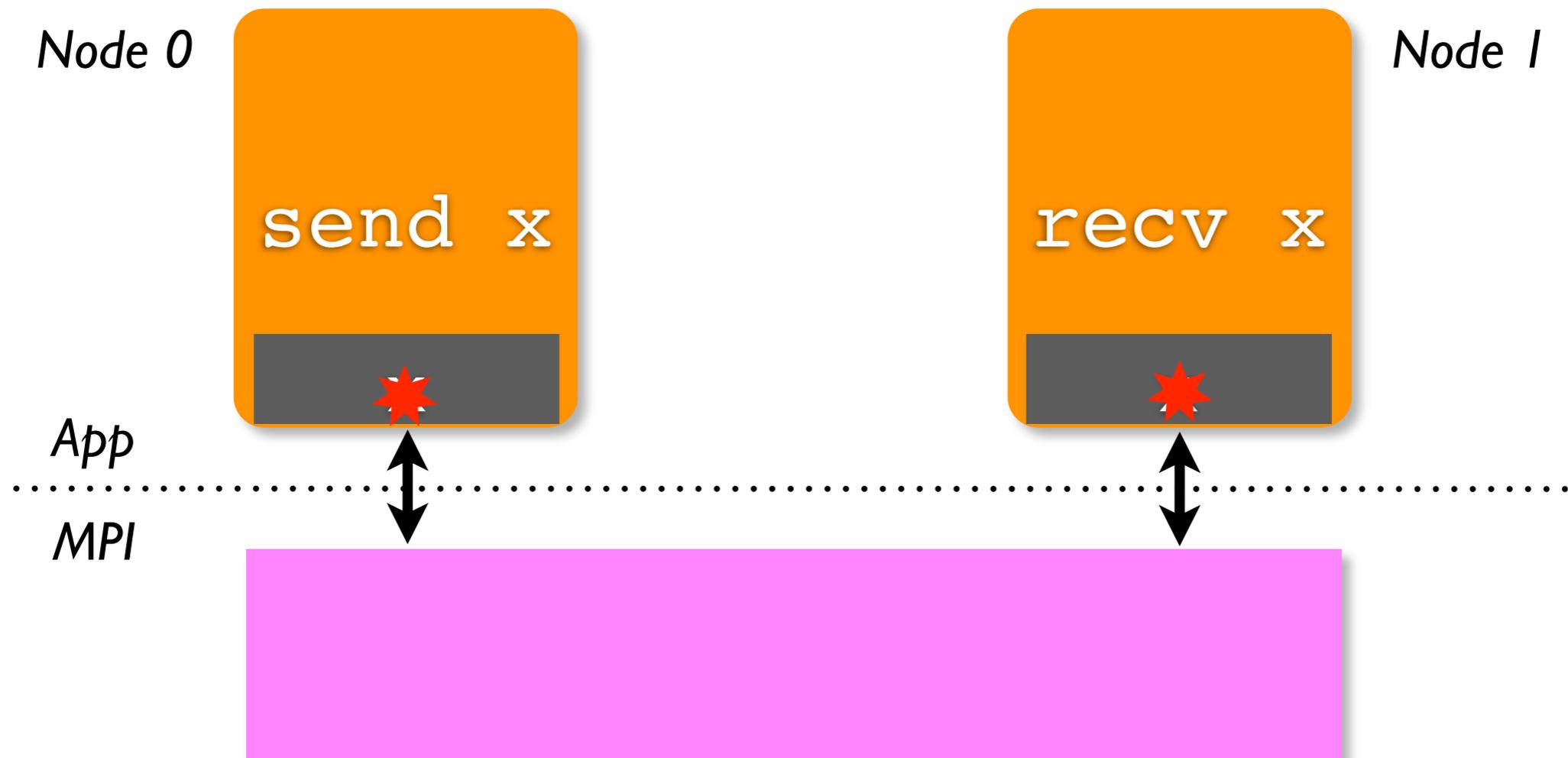
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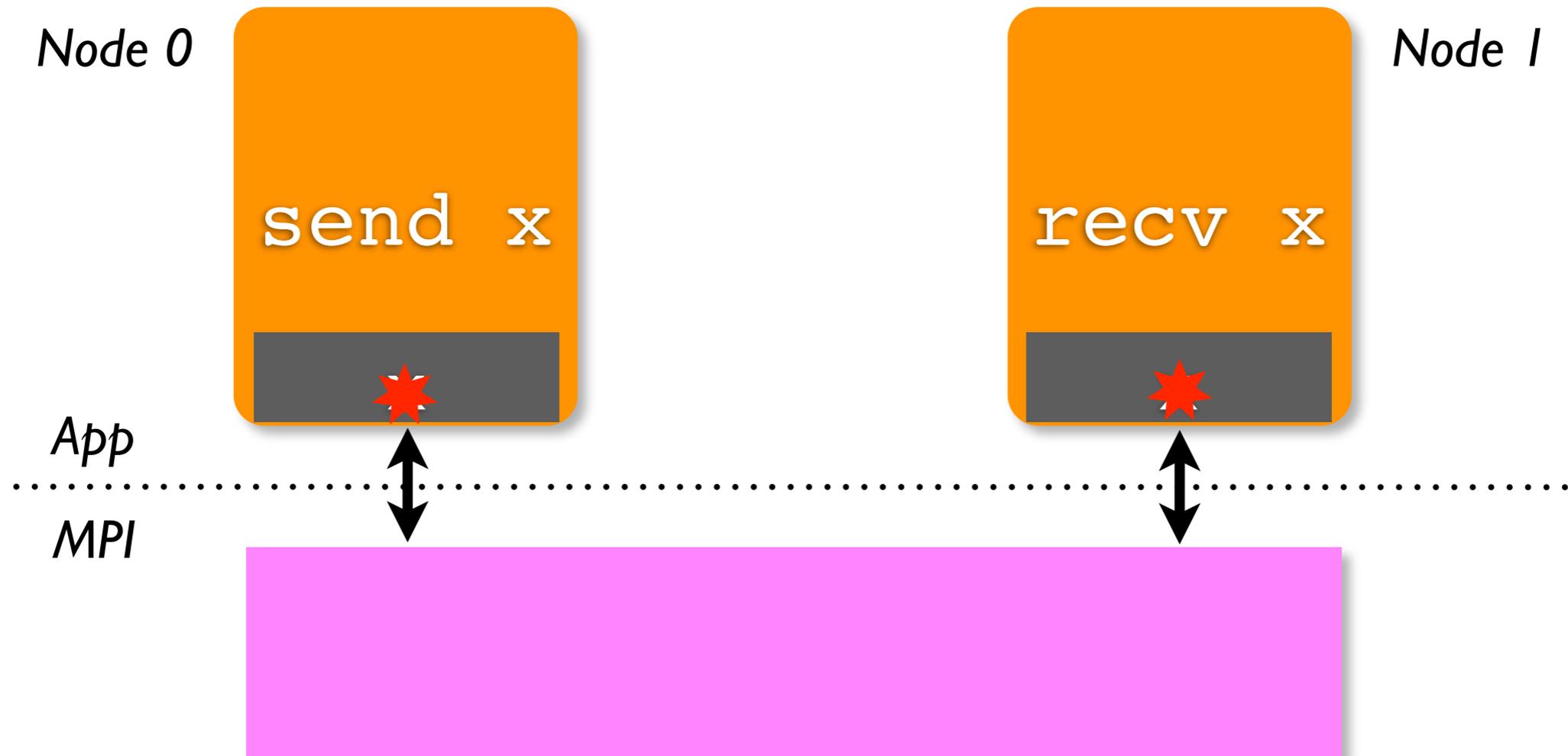
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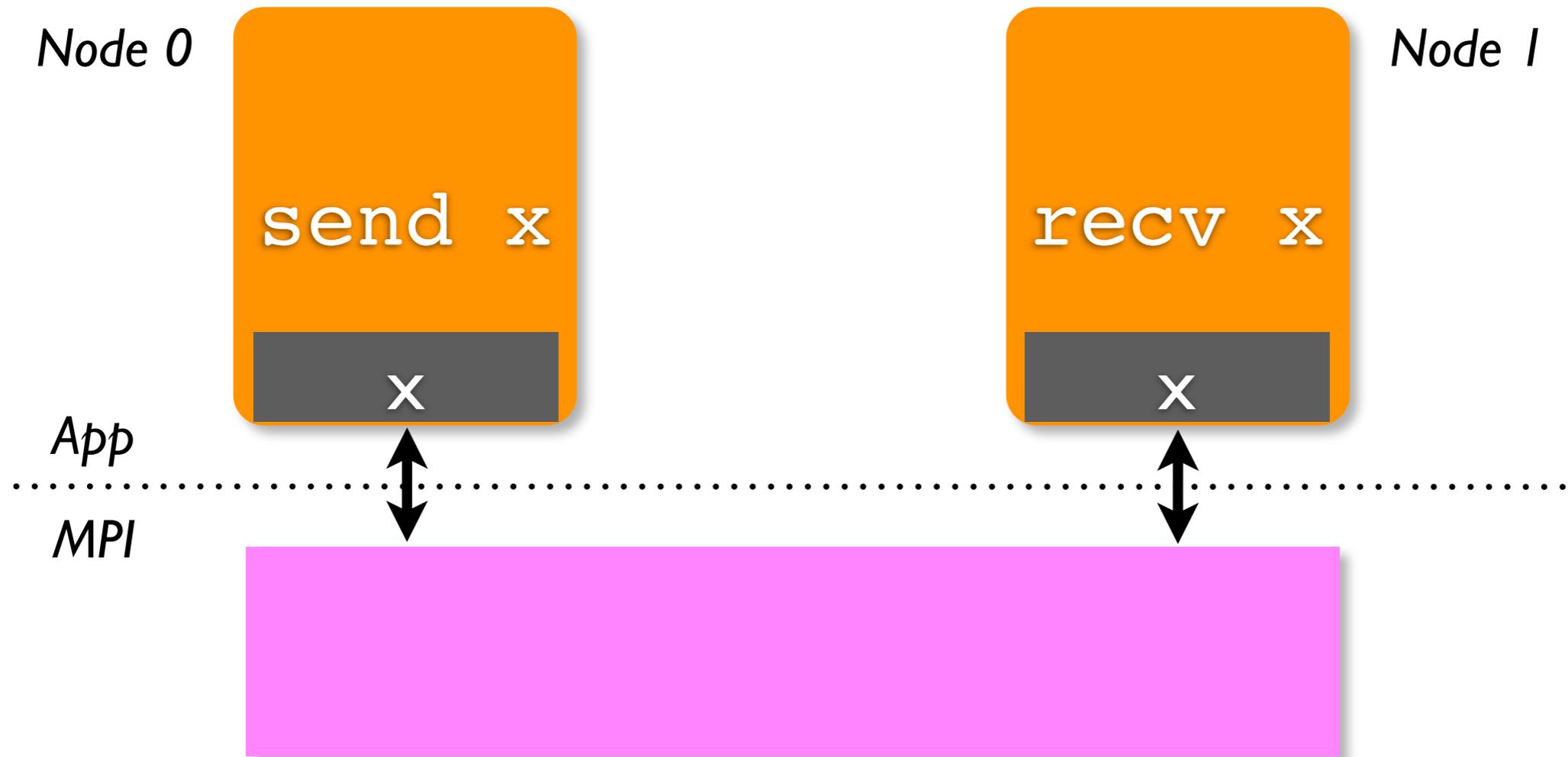


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*(requires rendezvous or compiler intervention)*

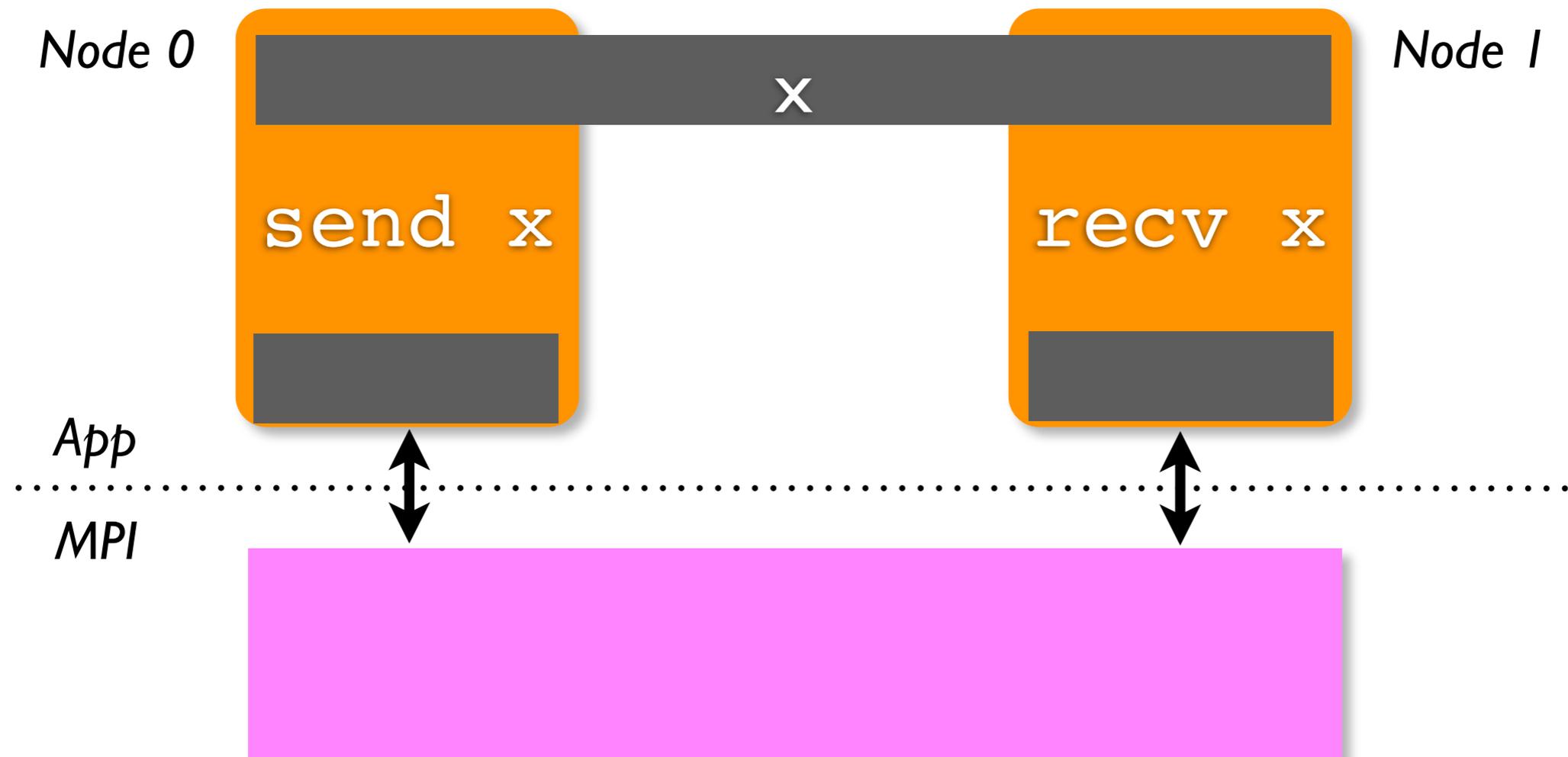
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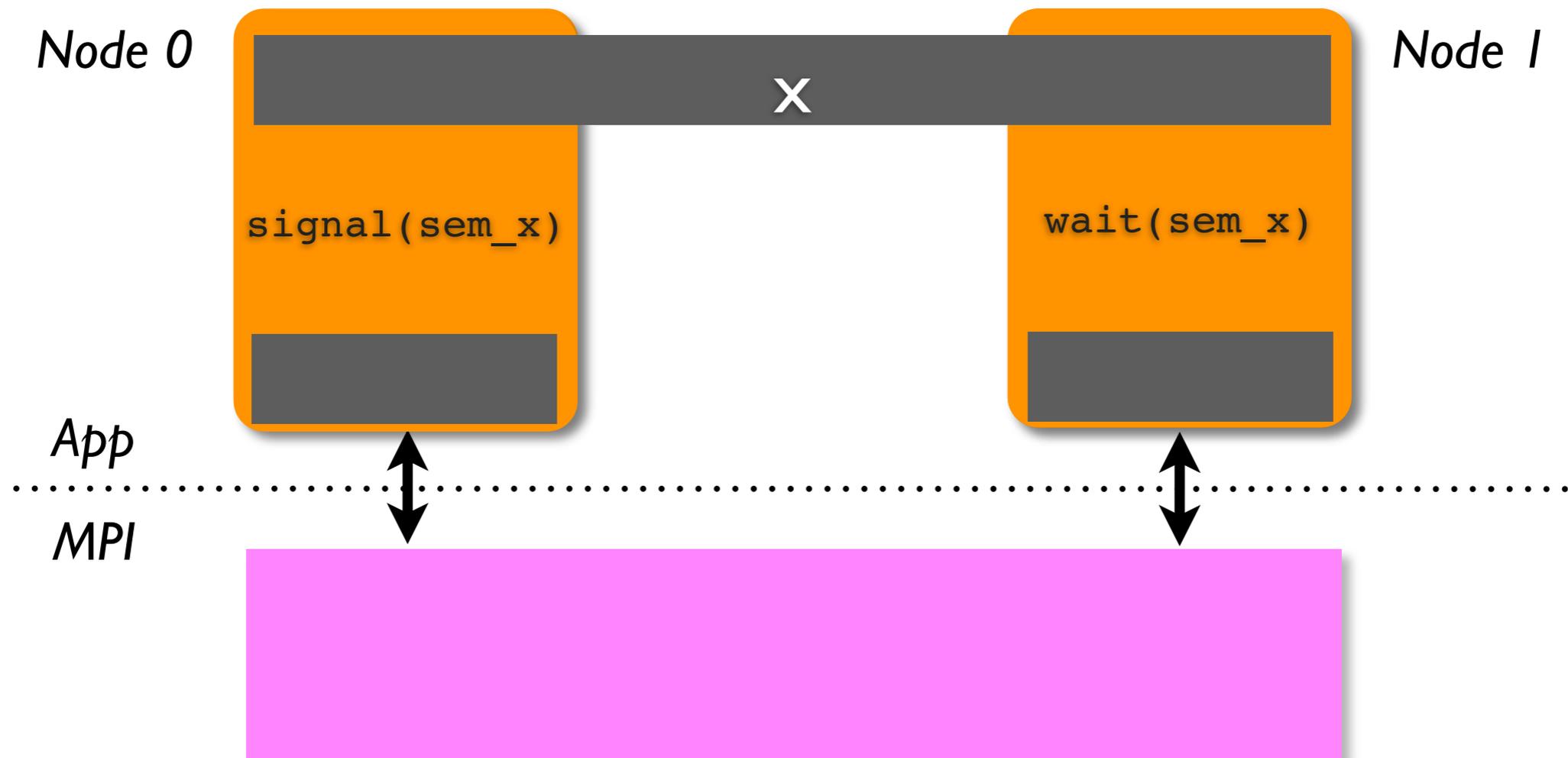
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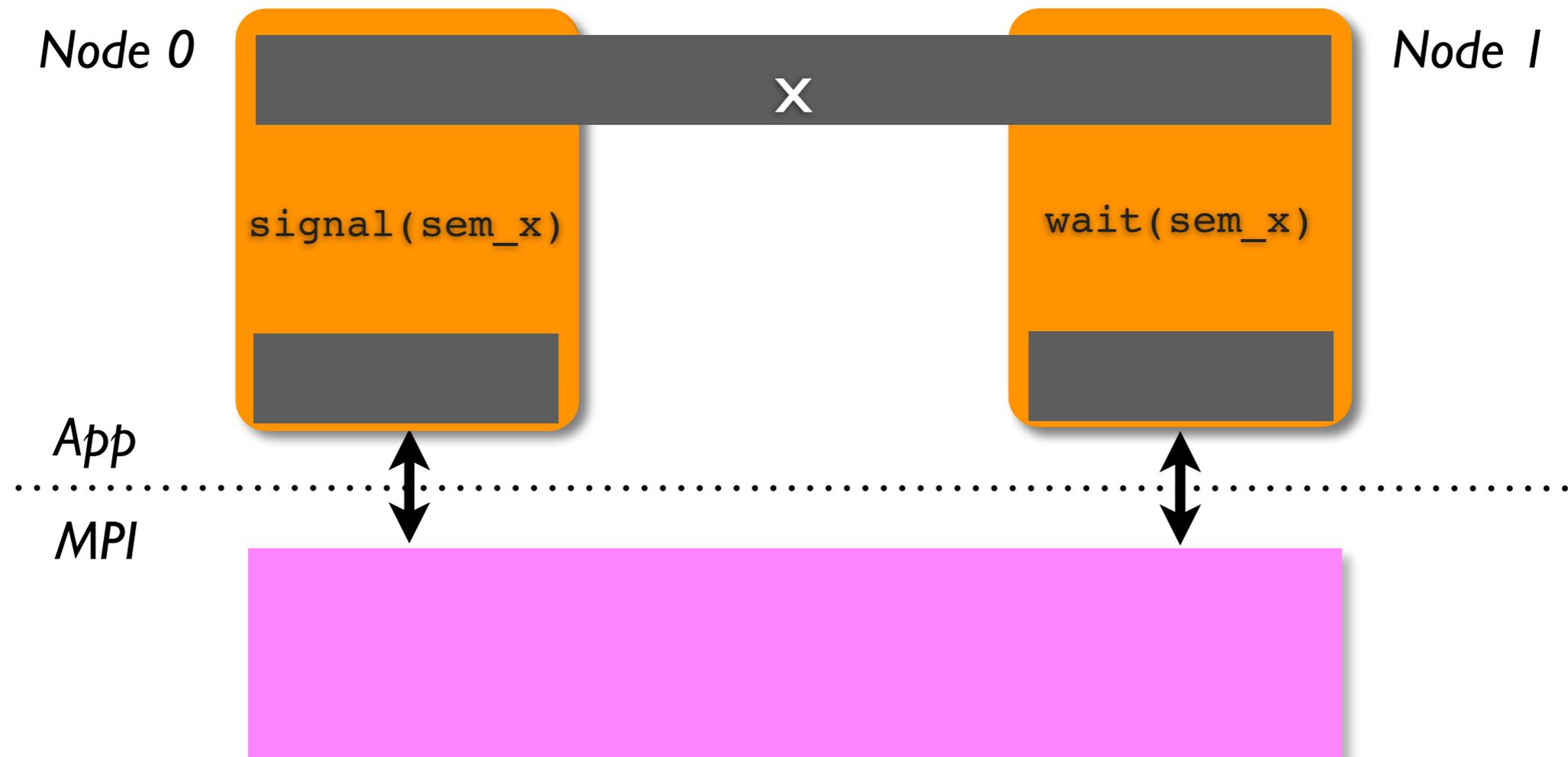
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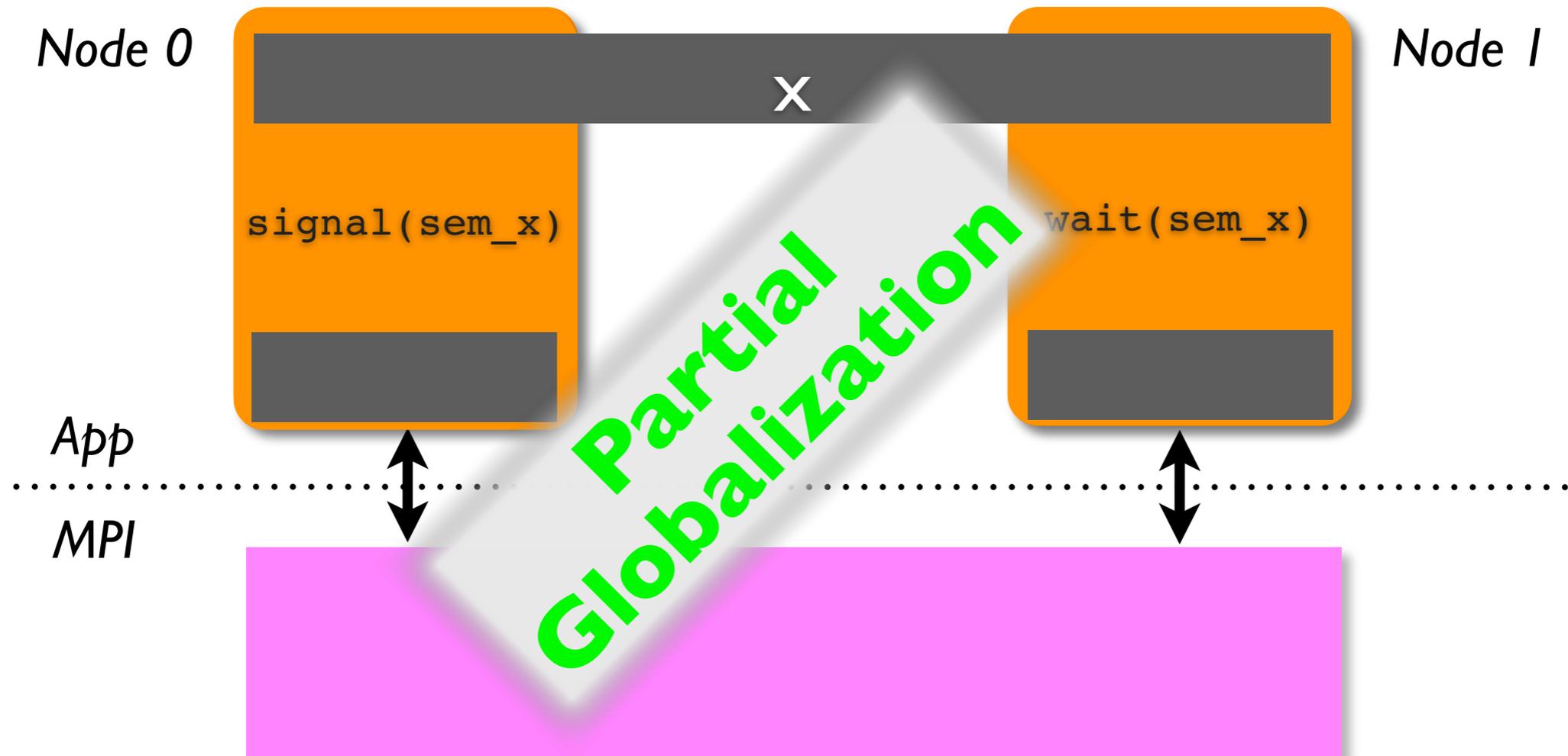


*(requires compiler intervention)*



# Optimizing for Shared Memory

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@communicate {x@0 <<= x@1}
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0 copy  
(requires compiler intervention)

# Steps for Optimizing Communication with Shared Memory

- Identify globalization candidates
- Ensure correctness
  - insert appropriate synchronization
- Minimize contention
  - minimize synchronization points
  - minimize synchronization overheads
    - *using a run-time trick*



# Globalization Candidates

- Contiguous chunks of memory
  - excluding strided array sections, for example
  - contiguous array sections OK (but not implemented)
- Large buffers
  - communication inside loops
- Small local reuse



# Ensuring Correctness

```
@communicate {x@i <<= x@i+1,  
              where i in Kanor::WORLD}  
  
...  
consume(A);           // consume communicated data  
  
...  
overwrite(A);        // reuse A for local data  
  
...  
consume(A);           // consume local data
```



# Ensuring Correctness

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```
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```

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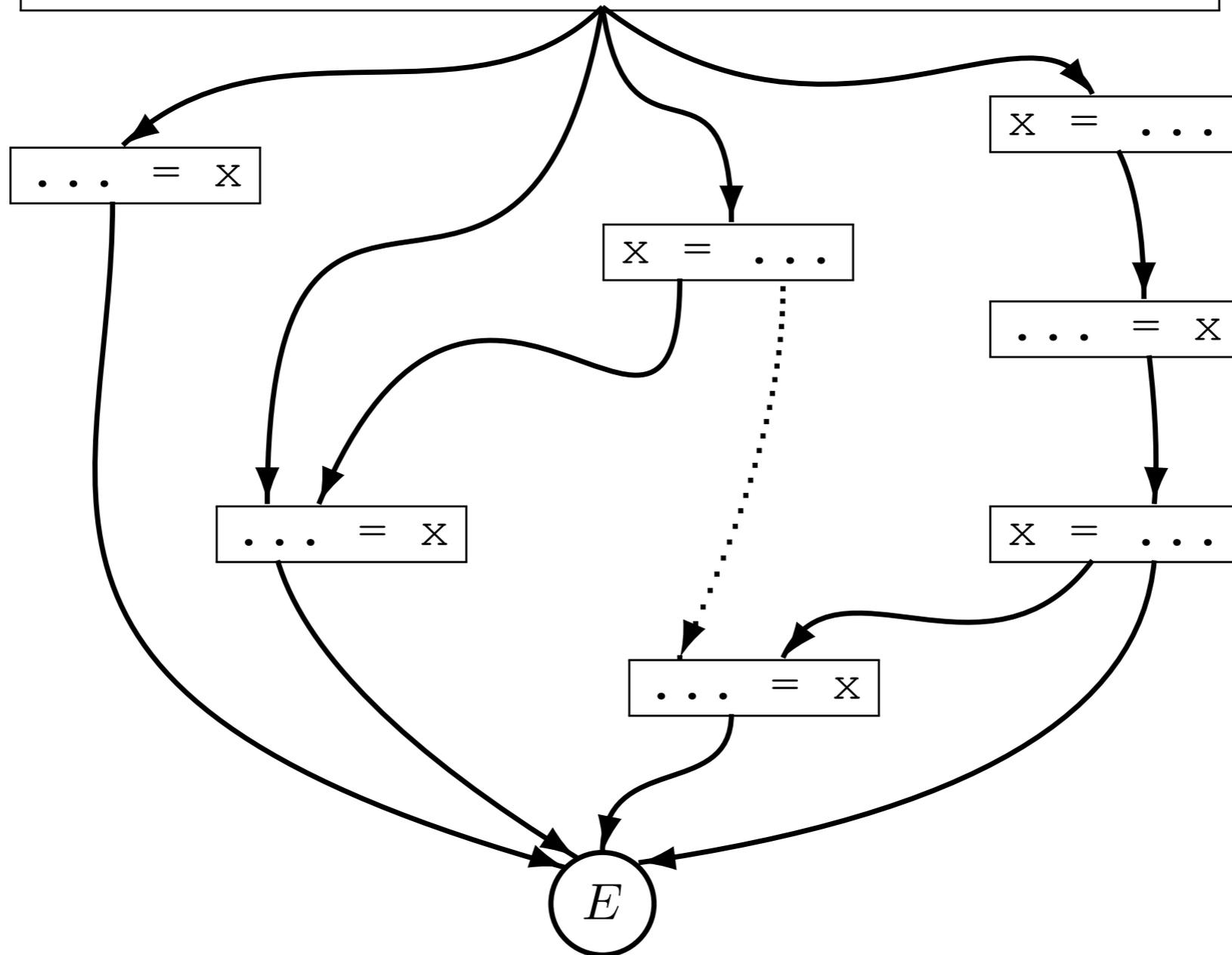
```
...
```

```
consume(A);           // consume local data
```



# Correctness Issues

`@communicate{x@i <<= x@0}, where i > 0`



# Observations

**Definition:** *Locking Set: The set of CFG nodes that lie on a path from a node containing local write into a globalized variable to a node containing read of that value*



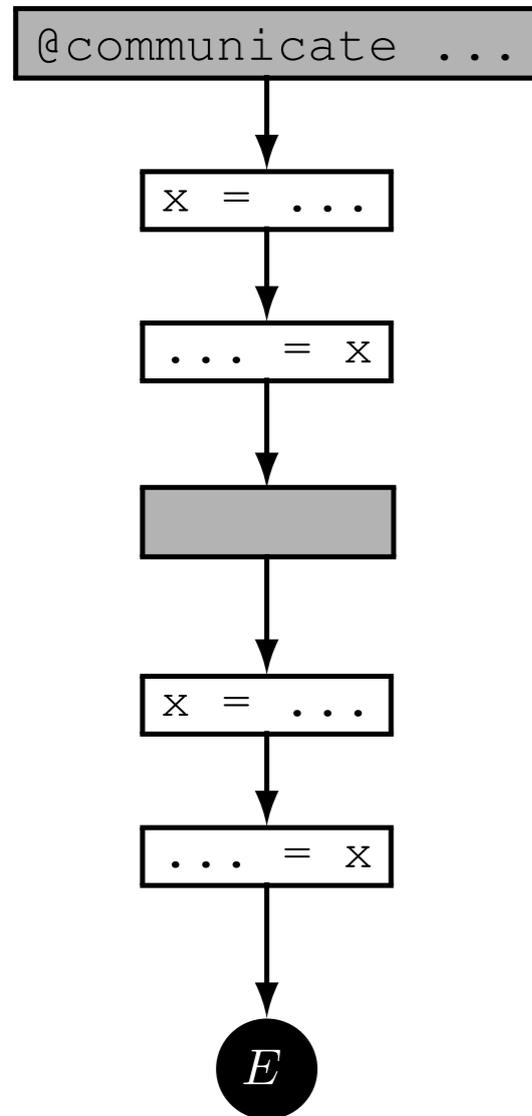
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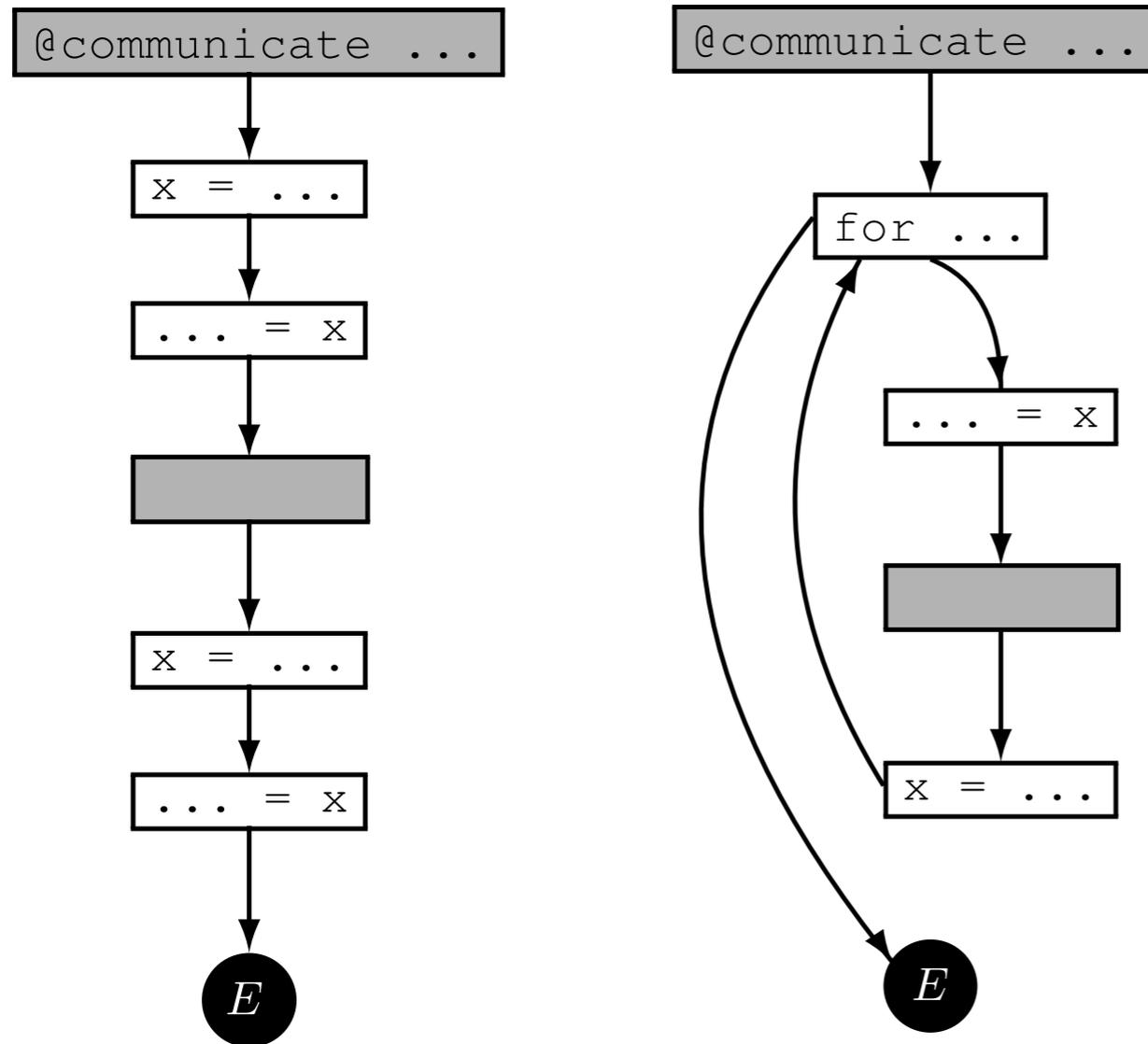
**Theorem:** *If the locking set belongs to a critical section then the partitioned address space semantics are maintained*



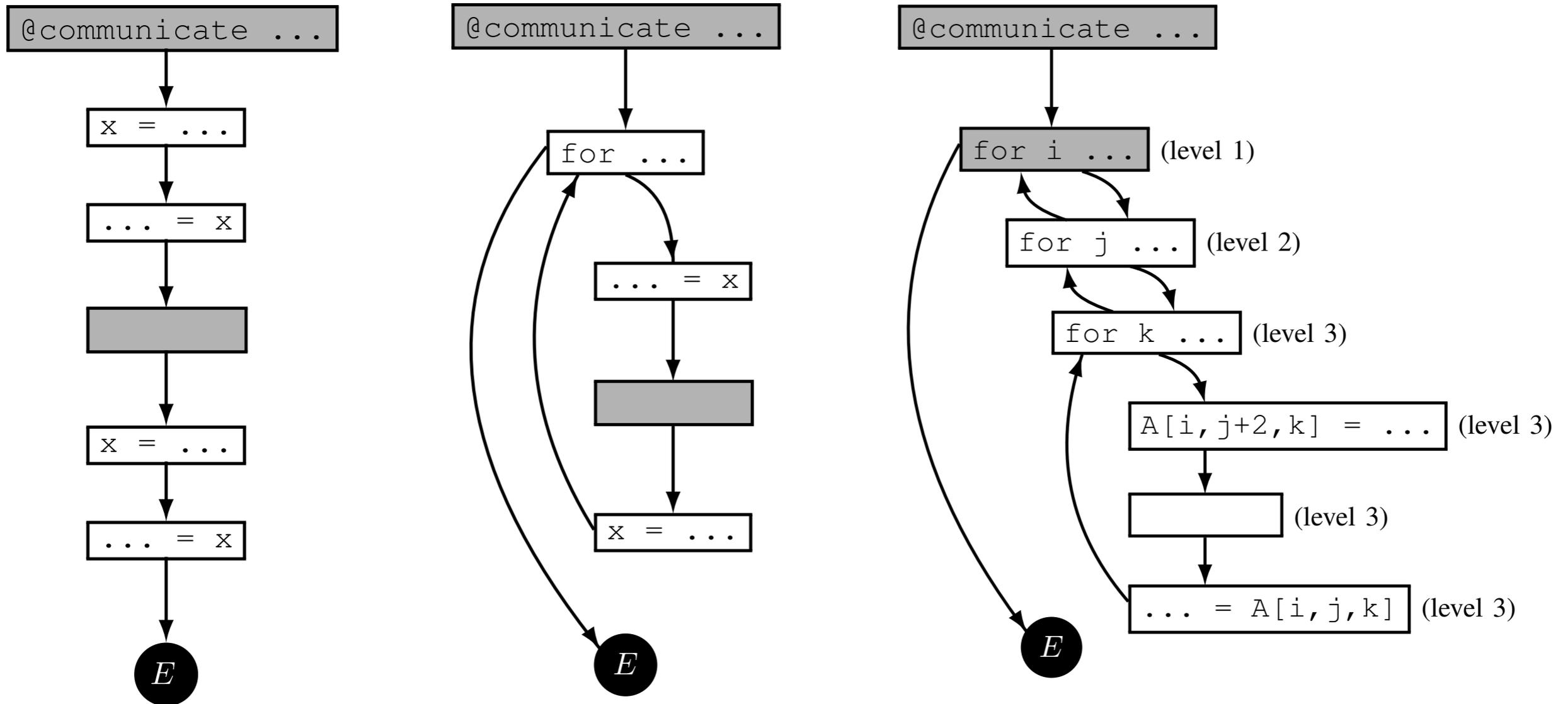
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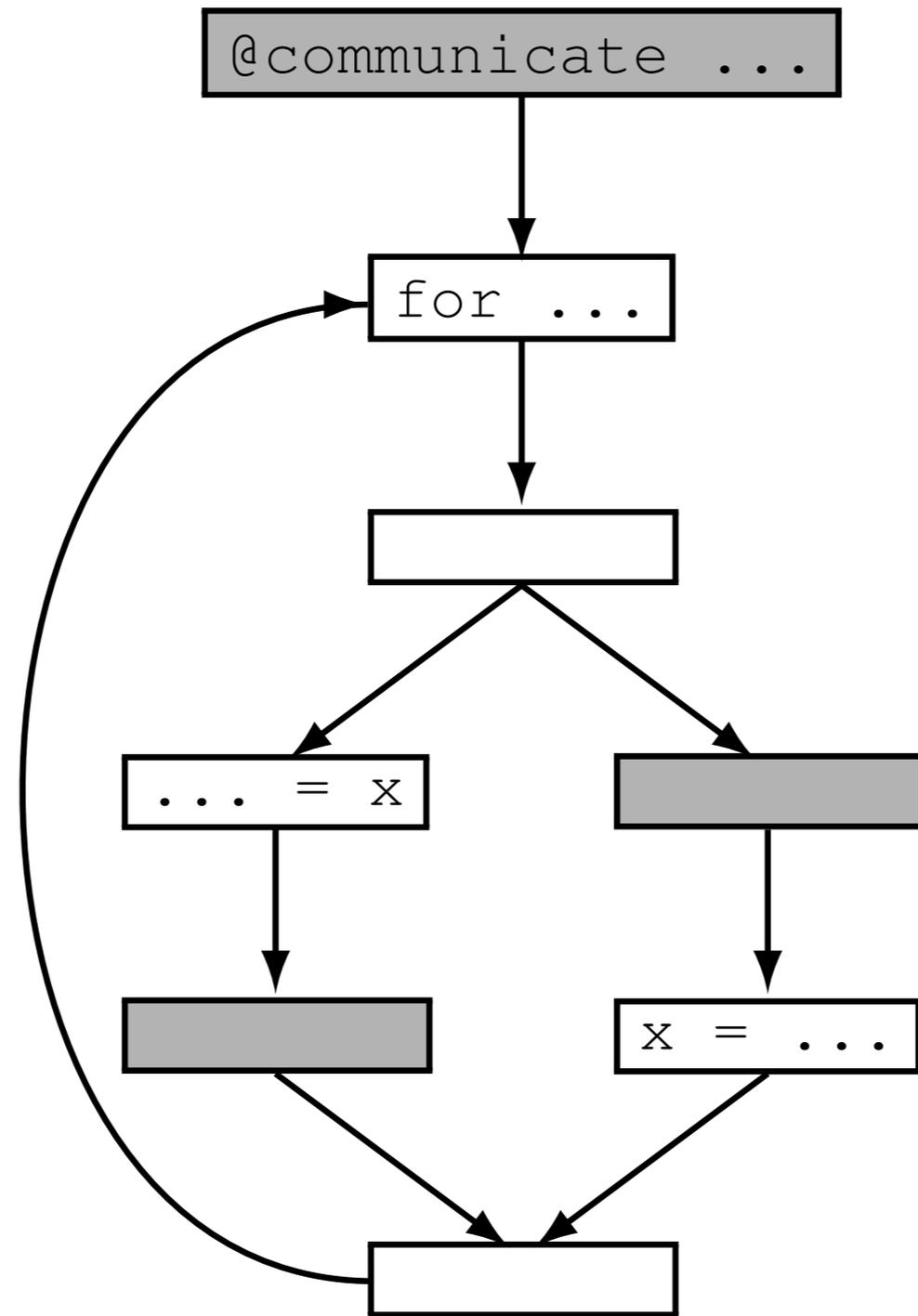


# Overall Algorithm

- Identify globalization candidates
- For each globalized variable
  - compute the *locking set*
  - divide the locking set into *connected components*,  $C_i$ 
    - CFG edge into  $C_i \Rightarrow$  insert `lock_acquire`
    - CFG edge out of  $C_i \Rightarrow$  insert `lock_release`



# Example of sub-optimal Behavior



# Copy-on-conflict

```
1 void acquire_or_copy (Buffer& a, Lock& lock)
2 {
3     if (Localized[a]) return NULL;
4     Condition cond;
5     enum {COPY_THRD, LOCK_THRD} notifier;
6     a_cpy = new Buffer;
7
8     Thread l_thrd =
9         spawn(acquire_lock, lock, cond, &notifier);
10    Thread c_thrd =
11        spawn(buf_copy, a, a_cpy, cond, &notifier);
12    wait(cond);
13
14    if (notifier == LOCK_THRD) {
15        c_thrd.kill();
16        free(a_cpy);
17    } else {
18        l_thrd.kill();
19        if (lock.held()) lock.release();
20        delete a;
21        a = a_cpy;
22        Localized[a] = true;
23    }
24 }
```



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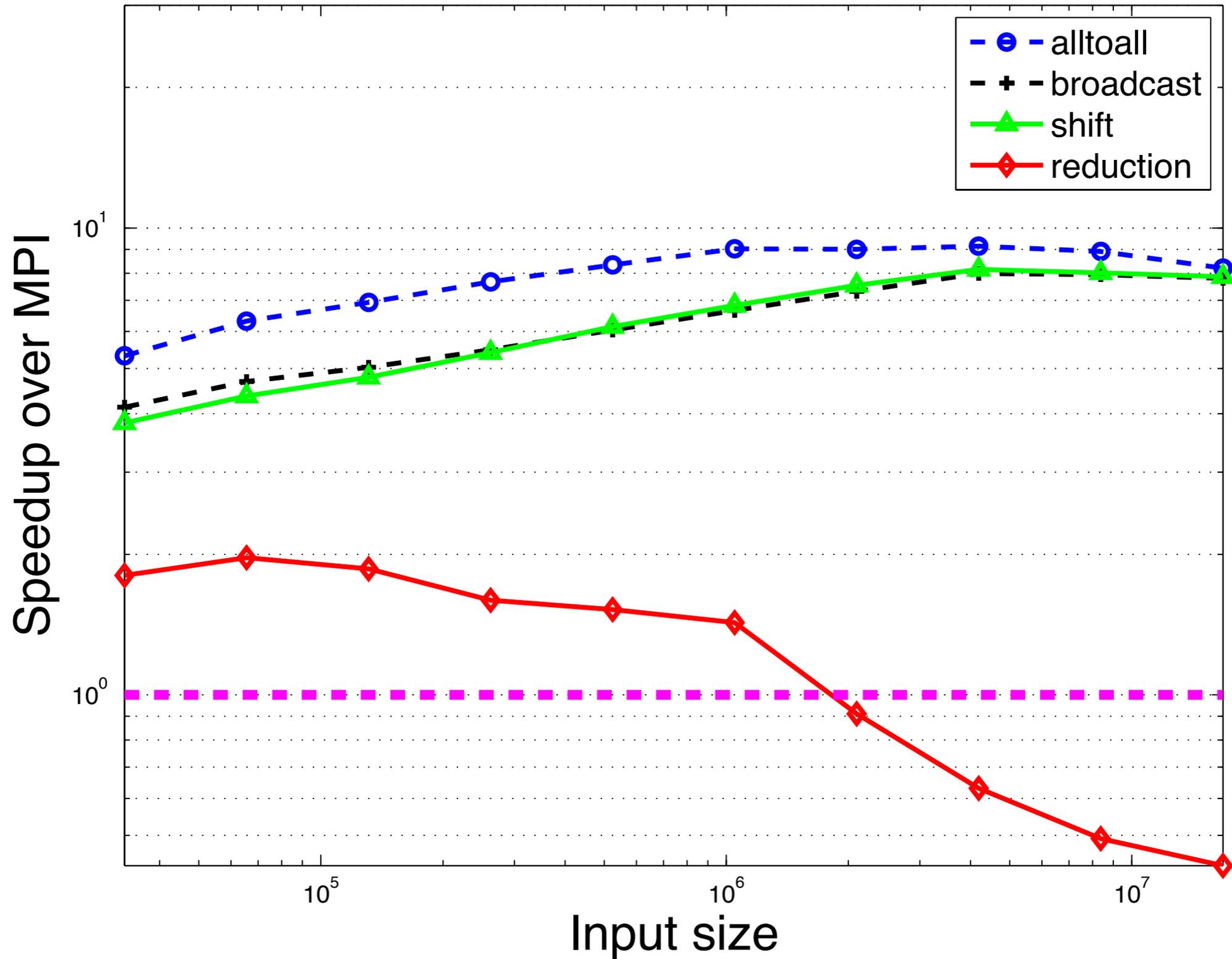
# Experimental Evaluation

<i>Op</i>	<i>Kanor</i>	<i>MPI</i>	<i>Shared Memory</i>
all	$A[j]@i \ll= A[i]@j$ where $i, j$ in WORLD	<code>MPI_Alltoall (...)</code>	<code>barrier();</code>
b'cast	$A@i \ll= A@0$ where $i$ in WORLD	<code>MPI_Bcast(A, ..., ..., 0, ...);</code>	<code>barrier();</code>
shift	$A@i \ll= A@i+1$	<code>if (Rank == (numprocs - 1)) dest = 0;</code> <code>else dest = Rank + 1;</code> <code>MPI_Send(A, array_size, ...);</code> <code>MPI_Recv(A, array_size, ...);</code>	<code>barrier();</code>
reduce	$A@0 \ll_{op} A@i$ where $i$ in WORLD	<code>MPI_Reduce (...)</code> <code>// or specialized code for</code> <code>// tree-reduction of ``op``</code>	<code>// loop for tree-reduction</code> <code>for (i ...) {</code> <code>    A[i] = op(...);</code> <code>}</code>

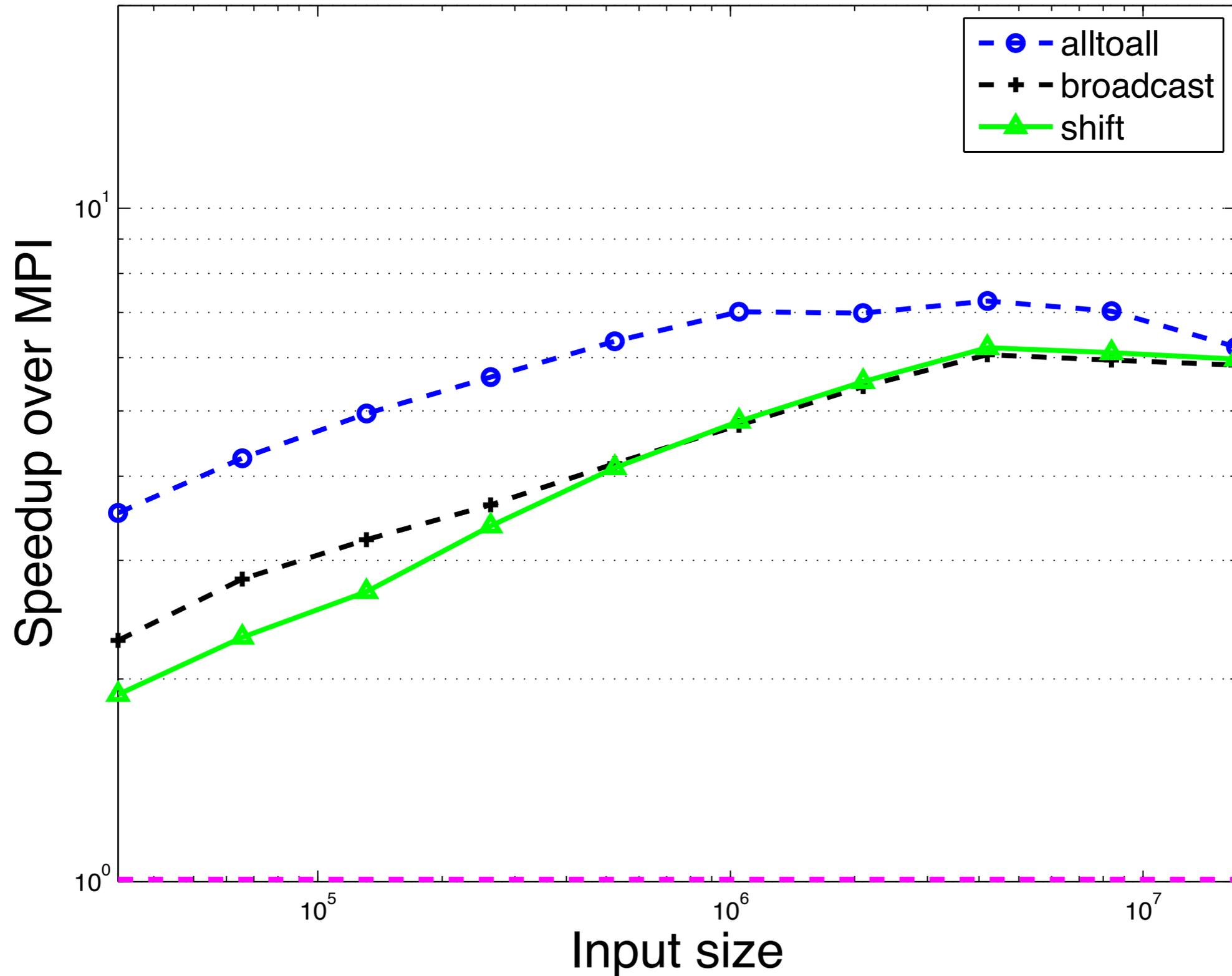
- 8-core AMD Opteron, Gentoo Linux, OpenMPI 1.4.3
- Case 1: No local writes
- Case 2: Local writes
  - 2a: lock successfully acquired
  - 2b: buffer copied locally before the lock could be acquired
- Case 3: Forced copying (overlapping live ranges)



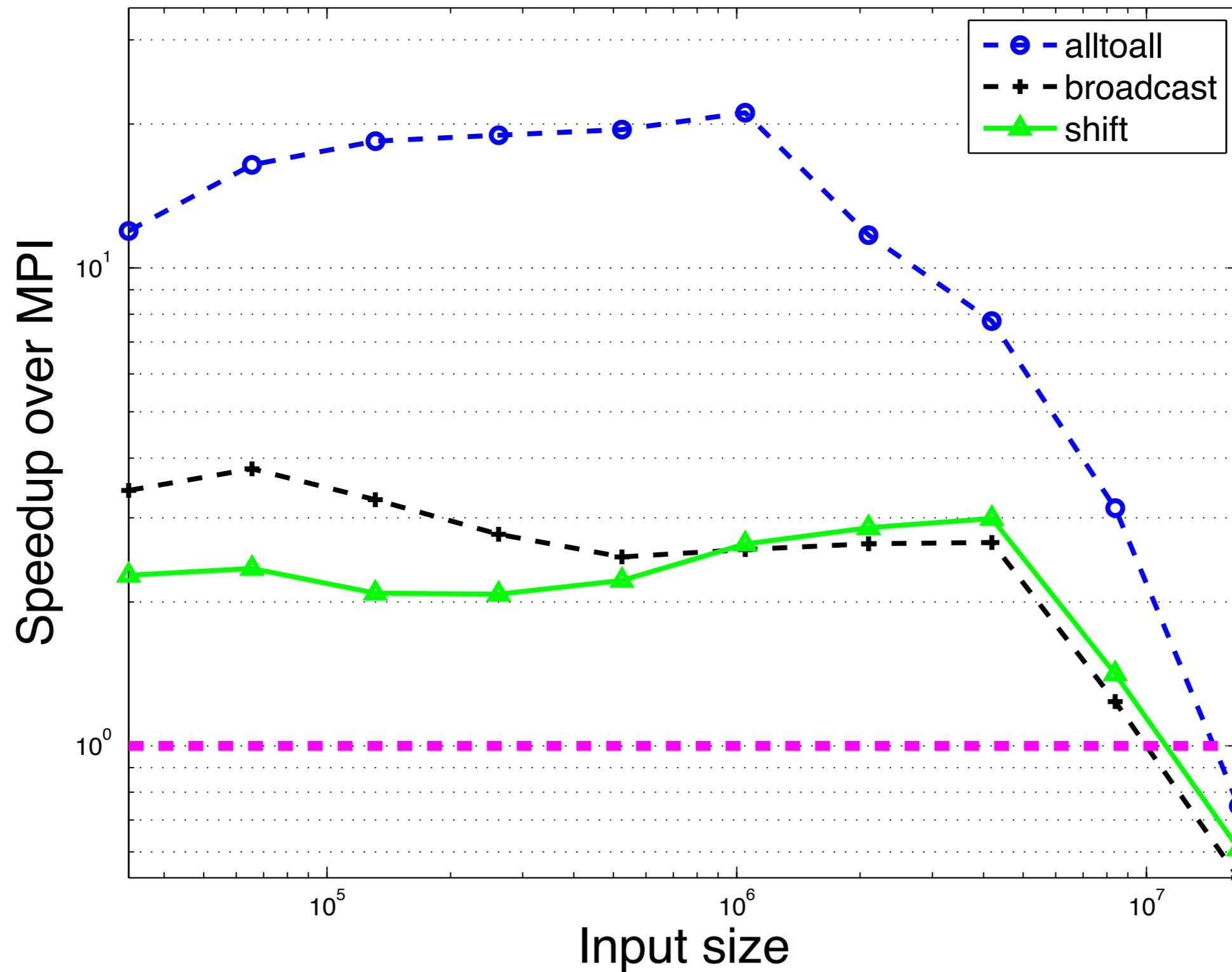
# Case I



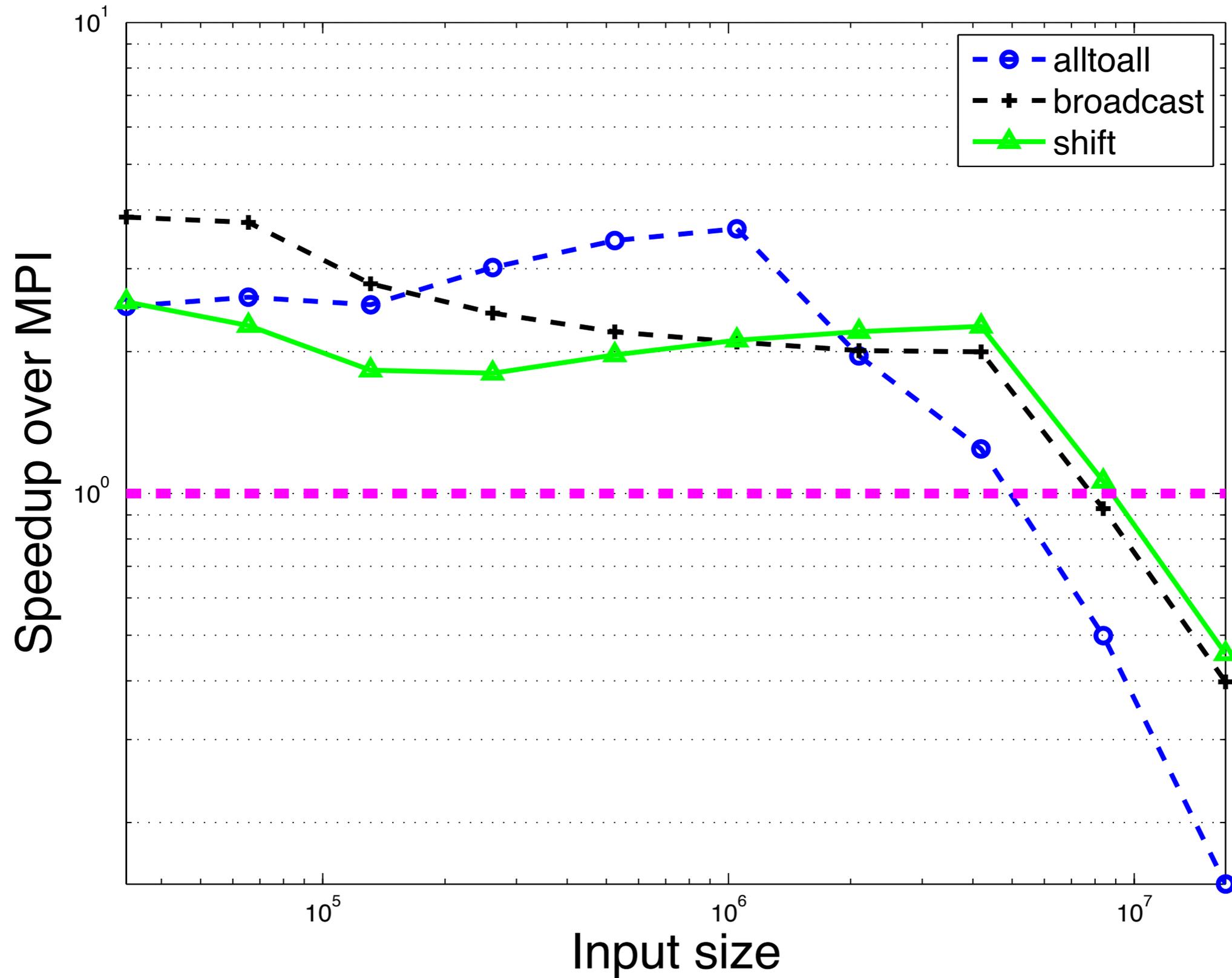
# Case 2a



# Case 2b



# Case 3



# Concluding Remarks

- Parallel programming with partitioned address spaces has advantages
- Appropriate abstraction makes parallel programming more accessible to intermediate-level programmers
  - Kanor demonstrates the effectiveness of this approach
- Advantages of shared memory can be obtained through compiler optimizations
  - our compiler algorithms and experimental evaluation substantiate this claim

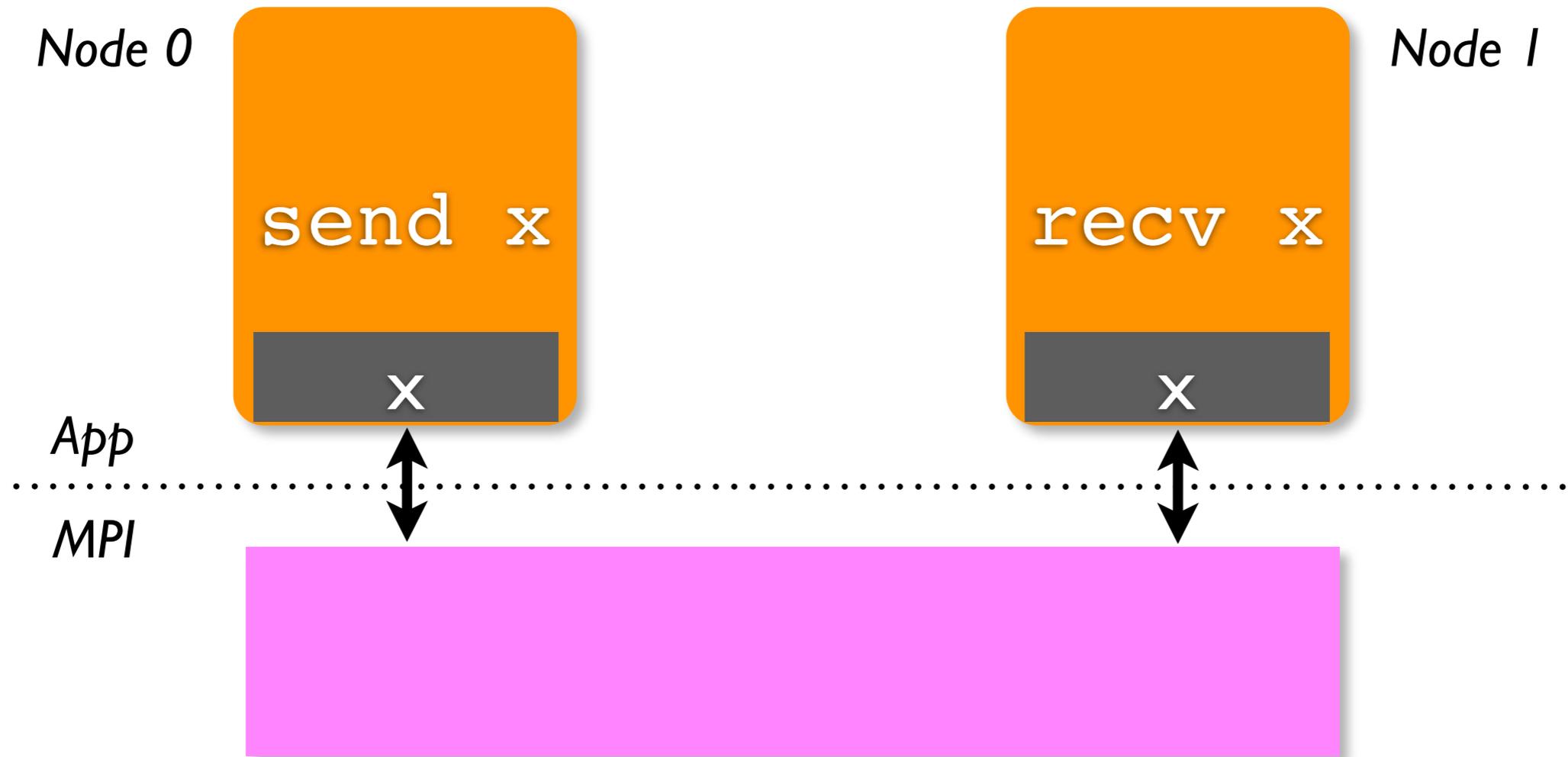


End



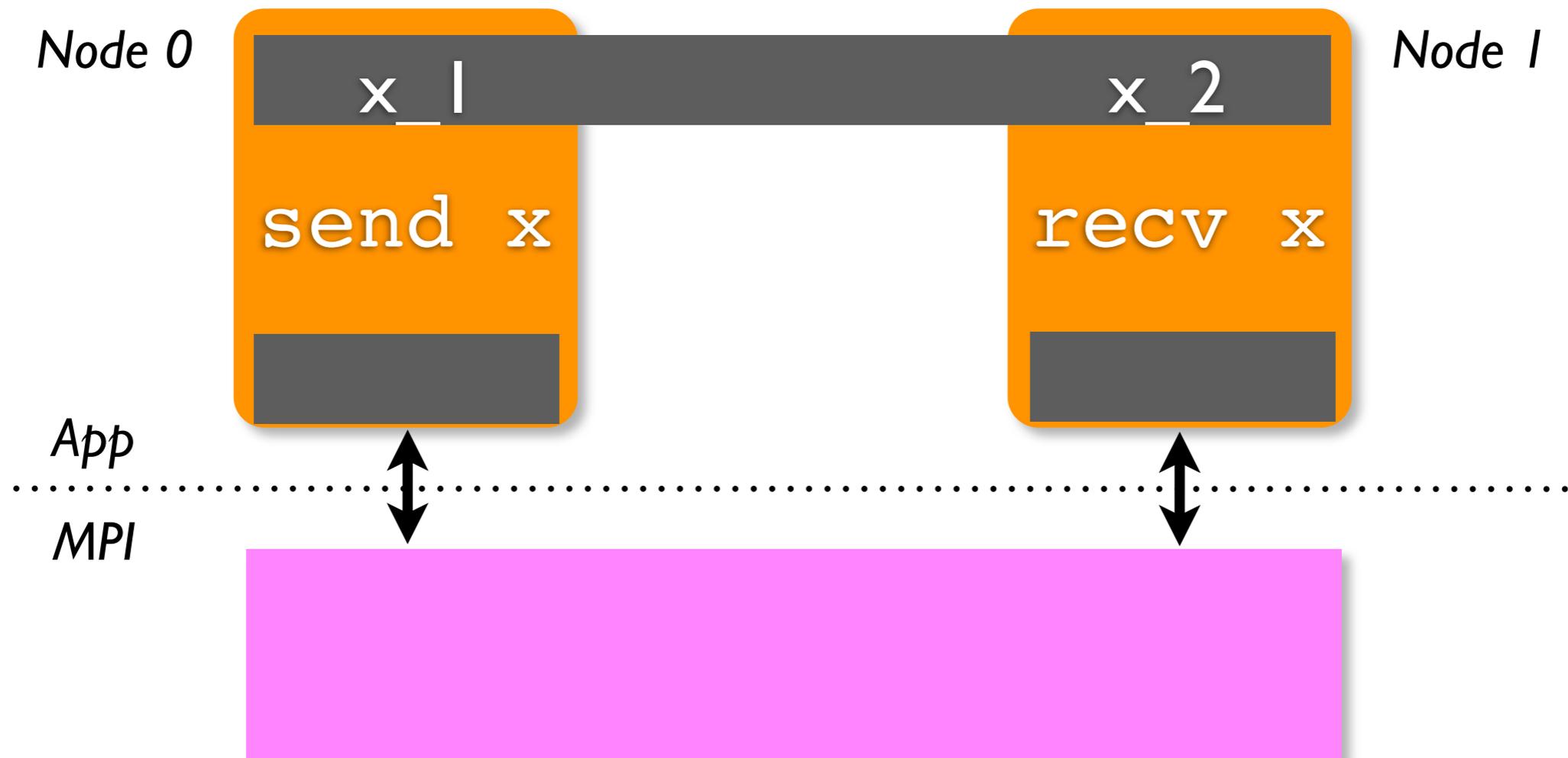
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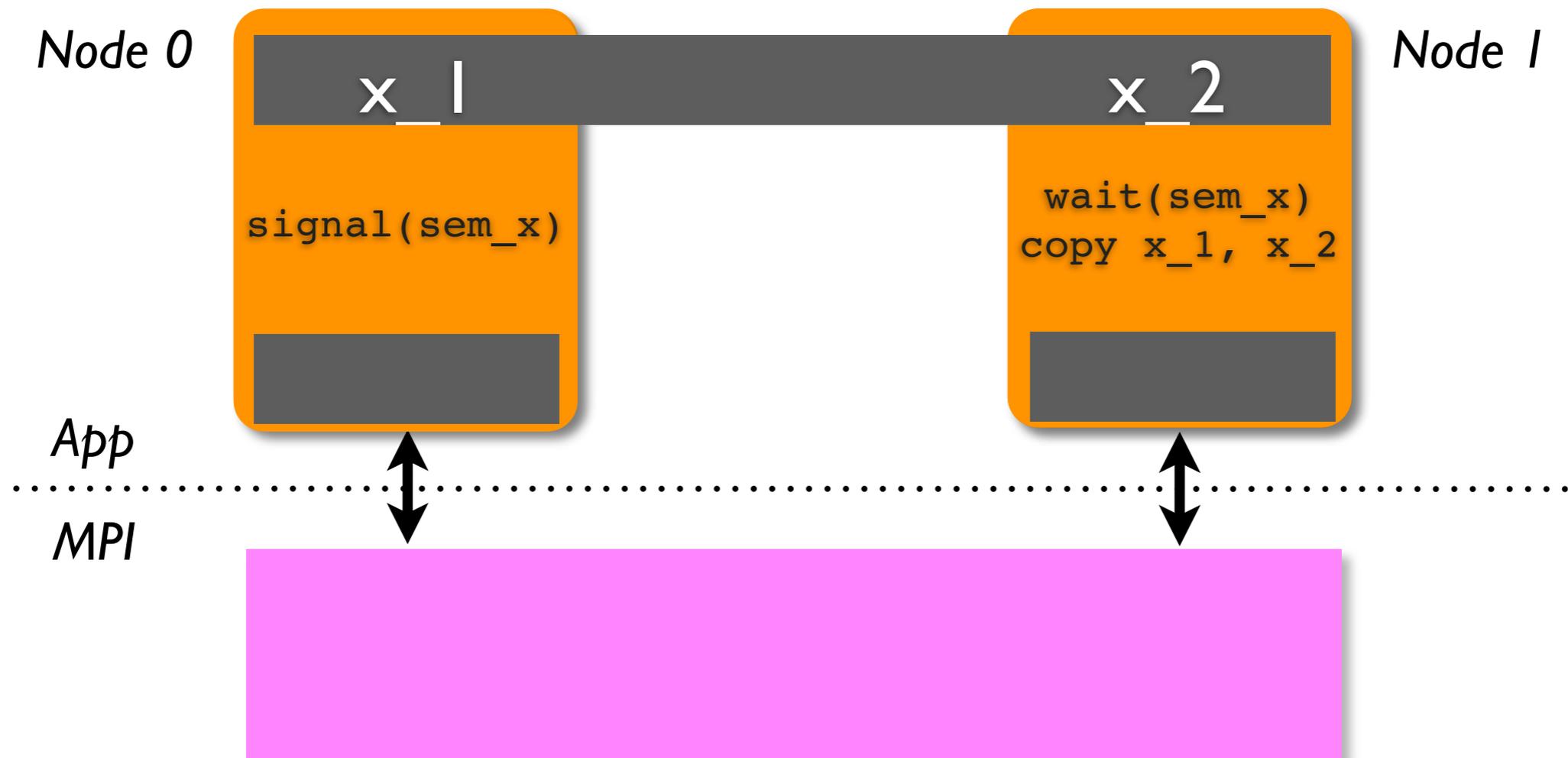
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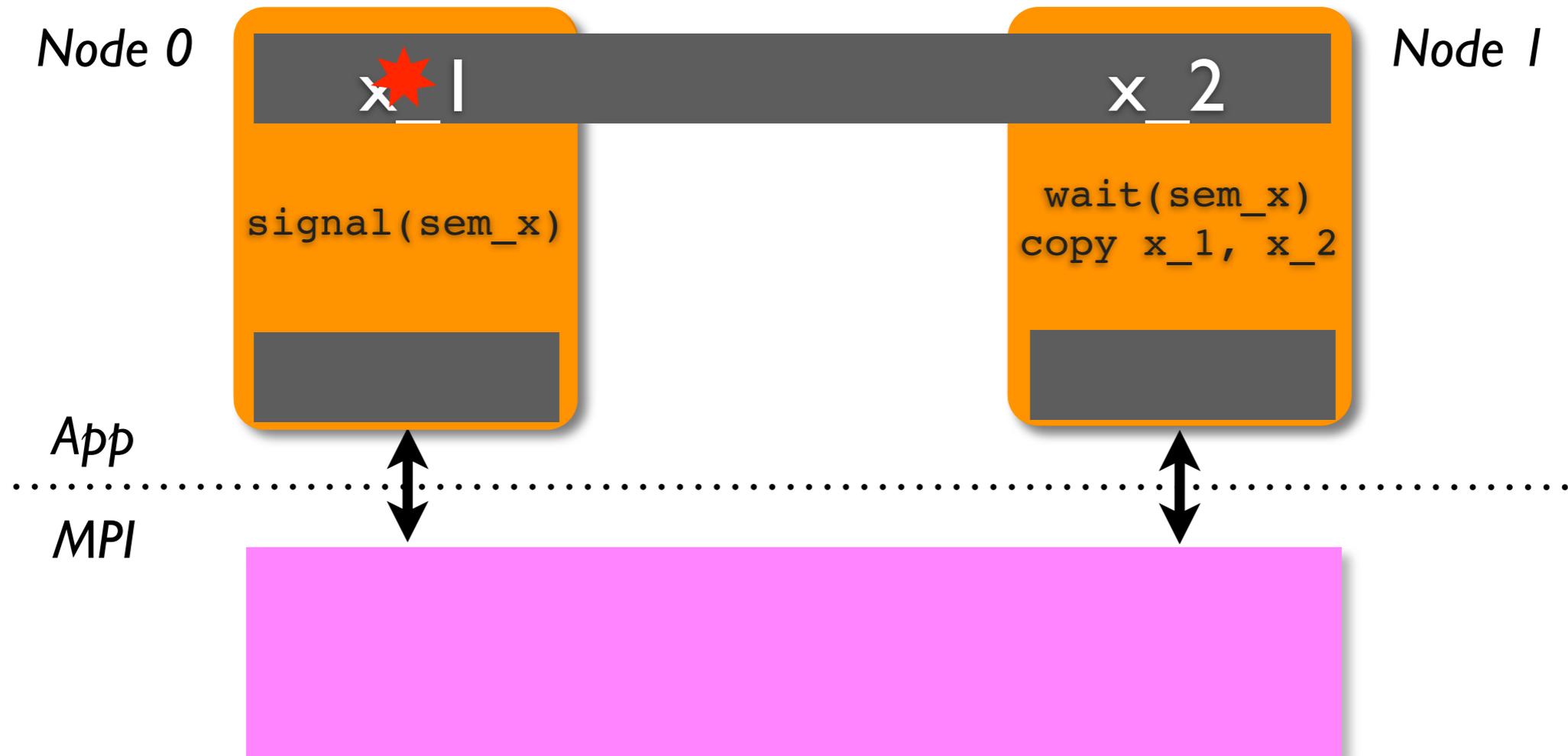
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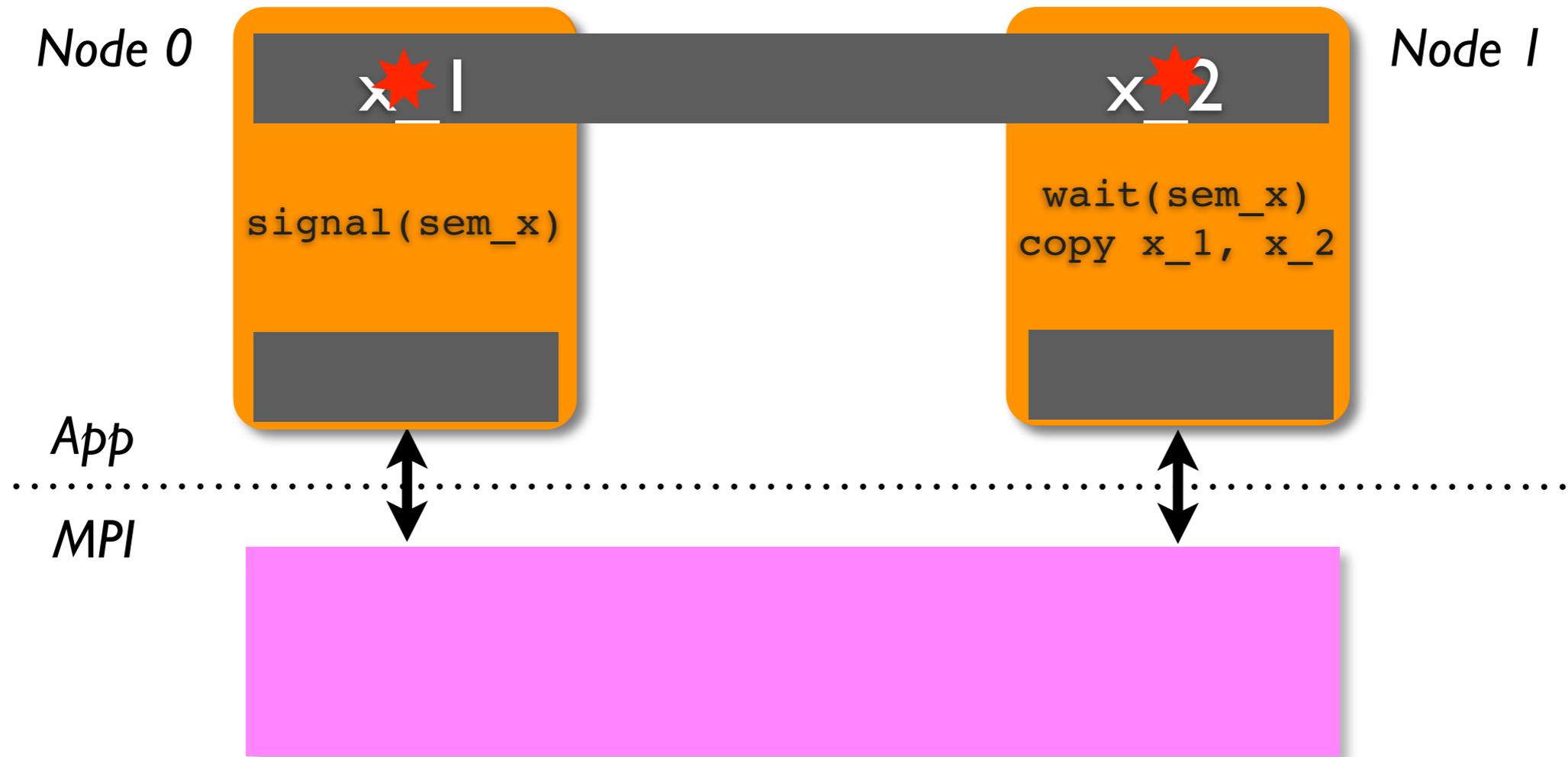
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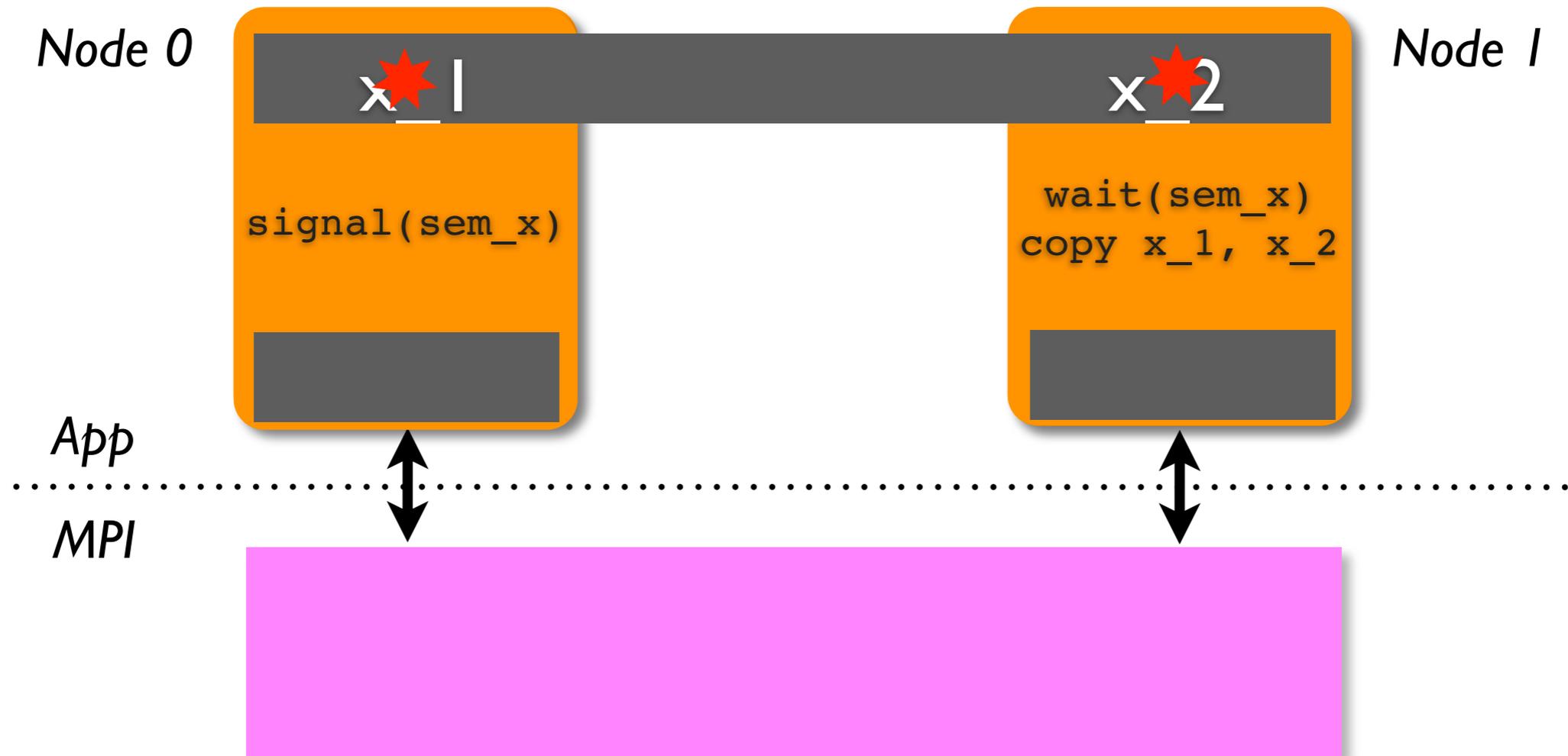
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1 copy  
(requires compiler intervention)



# Computing all Paths from $s$ to $t$

```
1 Algorithm: PATHS
2 Input: Directed graph  $G(V, E)$ 
           Start node  $s$ 
           End node  $t$ 
3 Output: Set  $P$  of nodes that lie on any path from  $s$  to  $t$ 

4  $P \leftarrow \phi$ 
5 for each node  $n$  in  $G$  do
6    $n.color \leftarrow \text{"white"}$ 
7  $Q \leftarrow [s]$ 
8 while not  $Q.empty$  do
9    $q \leftarrow Q.extract$ 
10  for each edge  $(q, v) \in E$  do
11    if  $v.color \neq \text{"red"}$  then
12       $v.color \leftarrow \text{"red"}$ 
13       $Q.add(v)$ 
14  $Q \leftarrow [t]$ 
15 while not  $Q.empty$  do
16    $q \leftarrow Q.extract$ 
17   for each edge  $(v, q) \in E$  do
18     if  $v.color \neq \text{"black"}$  then
19       if  $v.color = \text{"red"}$  then
20          $P \leftarrow P \cup \{v\}$ 
21          $v.color \leftarrow \text{"black"}$ 
22          $Q.add(v)$ 
23 return  $P$ 
```



# Computing Locking Sets

```
1 Algorithm: COMPUTE-LOCKING-SET
2 Input: CFG  $G(V, E)$  of code region over which variable  $x$  is
   globalized, with level-annotated nodes;
   dependence levels,  $l_x$ , for dependencies involving  $x$ ;
   dep. distances,  $d_x$ , for dependencies involving  $x$ ;
3 Output: Locking set  $L$ 


---


4  $L = \phi$ 
5 for each node pair  $(w, r)$  with an entry in  $l_x$  do
6   if  $d_x(w, r) = 0$  then
7     if  $l_x(w, r) = 0$  then
8        $L \leftarrow L \cup \text{PATHS}(G, w, r)$ 
9     else
10       $G'(V', E') \leftarrow G$  without any looping back-edges at
        level  $l_x(w, r)$  and lower
11       $L \leftarrow L \cup \text{PATHS}(G', w, r)$ 
12    else if  $d_x(w, r) = 1$  then
13       $h \leftarrow$  head node of loop at level  $l_x(w, r)$ 
14       $G'(V', E') \leftarrow G$  restricted to levels  $l_x(w, r)$  and higher
15       $L \leftarrow L \cup \text{PATHS}(G', w, h) \cup \text{PATHS}(G', h, r)$ 
16    else
17       $G'(V', E') \leftarrow G$  restricted to levels  $l_x(w, r)$  and higher
18       $L \leftarrow L \cup \text{PATHS}(G', w, r)$ 
19 return  $L$ 
```

