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Centro Nacional de Supercomputación



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Static analysis to enhance programmability and performance in OmpSs-2

Adrian Munera, Sara Royuela, Eduardo quiñones

**C3PO'20: Compiler-assisted Correctness Checking and
Performance Optimization for HPC**
Held in conjunction with **ISC 2020**

The need for Parallel Programming Models

Hardware Heterogeneity

HPC	 NVIDIA TitanV (5120 CUDA cores)	 Intel Xeon Phi KNL (72-core fabric)
Embedded systems	 NVIDIA Jetson (512 CUDA cores)	 Kalray MPPA (256-core fabric)

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Parallel Programming Models productivity

Programmability

Abstracts the parallelism while hiding the complexities of the underlying computing platform

Portability

The same source code is valid in different platforms, including SMP and heterogeneous systems

Performance / Scalability

Rely on run-time mechanisms to exploit the performance capabilities of parallel platforms

The programming models melting pot

- Several programming models targeting productivity coexist:
NVIDIA CUDA, Intel TBB, OpenCL, Cilk++, C++11, OpenACC, OpenMP, OmpSs, Pthreads, etc.
- Productivity is recipe for success:
 - **High-level APIs** are less complex and entail mild learning curves.
 - Models based on **compile-time directives** allow incremental parallelization, without sacrificing portability and programmability.
 - **Task-based models** offer the flexibility needed for dynamic and unstructured applications.



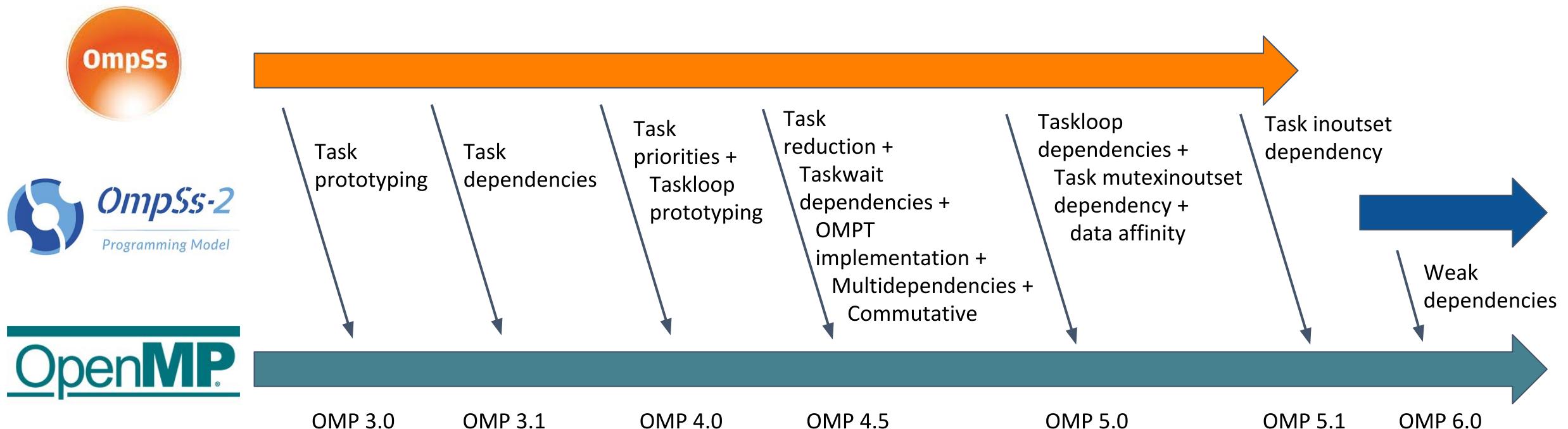
*Fools ignore complexity.
Pragmatists suffer it.
Some can avoid it.
Geniuses remove it.*
Alan Perlis



OmpSs-2 and the future OpenMP

Introducing changes in the OpenMP specification is a long-distance race.

The main goal of OmpSs/OmpSs-2 is **fast-prototyping tasking features** to include them in OpenMP.



Outline

- Introduction to OmpSs-2
- Proposed algorithms for programmability and performance
 - Auto-scope + Evaluation
 - Auto-release + Evaluation
- Implementation
- Discussion

OmpSs-2: execution model

- OmpSs-2 is a ***thread-pool*** based model: parallelism is spawned when the application starts and joined when it finishes.

```
1: int main (void) {
2: // Thread pool spawns, like #pragma omp parallel
3: // Only one thread executes, like #pragma omp single
4: int x[10], a;
5: for (int i = 0; i<4; ++i) {
6:
7:
8:
9:
10:
11: }
12:
13: return 1;
14: // Thread pool is joined, like #pragma omp barrier
15: }
```

OmpSs-2: execution model

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- When a thread of the program encounters a task construct, it creates a **task**. That can be executed by any of the spawned threads.

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6: // Creation of tasks
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8: {...}
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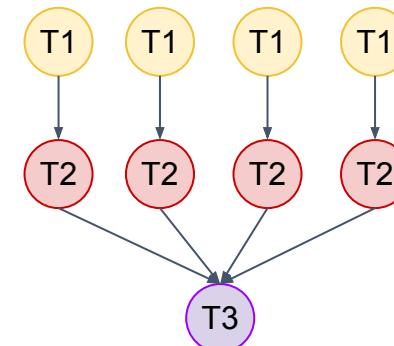
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```
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2: // Thread pool spawns, like #pragma omp parallel  
3: // Only one thread executes, like #pragma omp single  
4: int x[10], a;  
5: for (int i = 0; i<4; ++i) {  
6: // Creation of tasks  
7: #pragma oss task shared(x) out(x[i]) label(T1)  
8: {...}  
9: #pragma oss task shared(x) in(x[i]) label(T2)  
10: {...}  
11: }  
12: #pragma oss taskwait label(T3)  
13: return 1;  
14: // Thread pool is joined, like #pragma omp barrier  
15: }
```

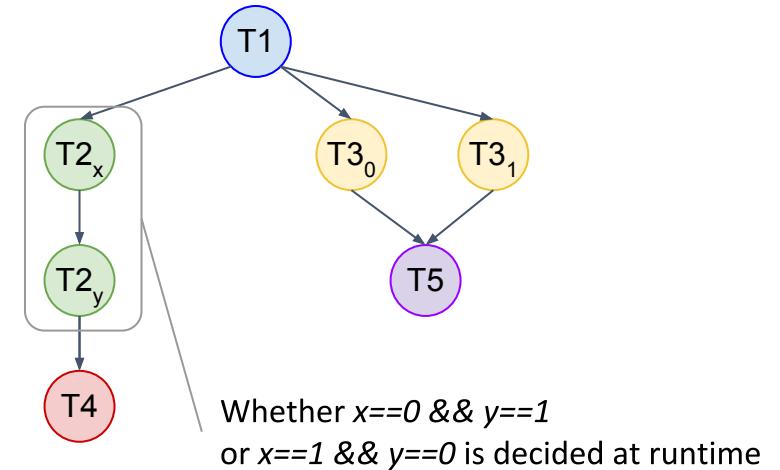
This generates a
Task Dependency Graph



OmpSs-2: task dependencies

- **in, out, and inout clauses** (same as in OpenMP)
- **concurrent**: This clause is like inout, but allows parallelism across tasks with a concurrent dependency of the same object (extra synchronizations, like atomics, might be needed).
- **commutative**: This clause also acts as inout, but allows any ordering between tasks with the same commutative dependency.
- **Taskwait dependencies**: The taskwait construct accepts dependencies, and acts as an empty task.

```
1: #pragma oss task out(a) out(b) label(T1)
2: {...}
3: for (int i = 0; i<2; ++i)
4:   #pragma oss task commutative(a) label(T2)
5:   {...}
6: for (int i = 0; i<2; ++i)
7:   #pragma oss task concurrent(b) label(T3)
8:   {...}
9: #pragma oss taskwait in(a) label(T4)
10: #pragma oss taskwait in(b) label(T5)
```

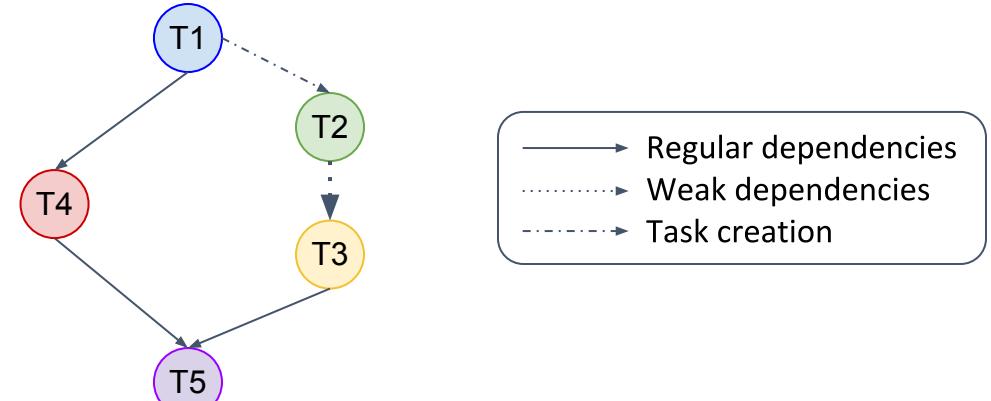


OmpSs-2: nested tasks and dependencies

- A task defines two types of dependencies:
 - data accessed by the task: *regular dependencies*.
 - data accessed by subtasks: ***weak dependencies***.
- **Linked dependency domains** between parent and children tasks:

- How {
- *regular dependencies* are released when the task finishes
 - *weak dependencies* are released when the corresponding children task has finished
- Why {
- avoid *data races* between tasks with different parents.

```
1: int x, y;
2: #pragma oss task weakout(x) out(y) label(T1)
3: {
4:     #pragma oss task out(x) label(T2)
5:     { x = 1; }
6:     y = 2;
7: }
8: #pragma oss task in(x) label(T3)
9: { assert(x == 1); }
10: #pragma oss task in(y) label(T4)
11: { assert(y == 2); }
12: #pragma oss taskwait label(T5)
```



OmpSs-2: early release of dependencies

OmpSs-2 allows executing tasks to early release their dependencies using the **release** directive.

This provides fine-grained control for tasks that describe a large set of data-dependencies that are processed in chunks.

T2 consuming *data[i;chunk_size]*
can start as soon as release
data[i;chunk_size] is executed,
although T1 has not finished yet

```
1: int data[size];
2:
3: #pragma oss task out(data[0: size]) label(T1)
4: {
5:   for (int i = 0; i < size; i += chunk_size) {
6:     for (int j = i; j < chunk_size; j++)
7:       fast_process(&data[j]);
10:  }
11: #pragma oss release out(data[i:chunk_size])
12: }
13: for (int i = 0; i < size; i += chunk_size) {
14:   #pragma oss task in(data[i: chunk_size]) label(T2)
15:   {
16:     slow_process(&data[i], chunk_size);
17:
18:   }
19: }
```

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Auto-scope usefulness: related work

Manual scoping variables is *arduous* and *error-prone*

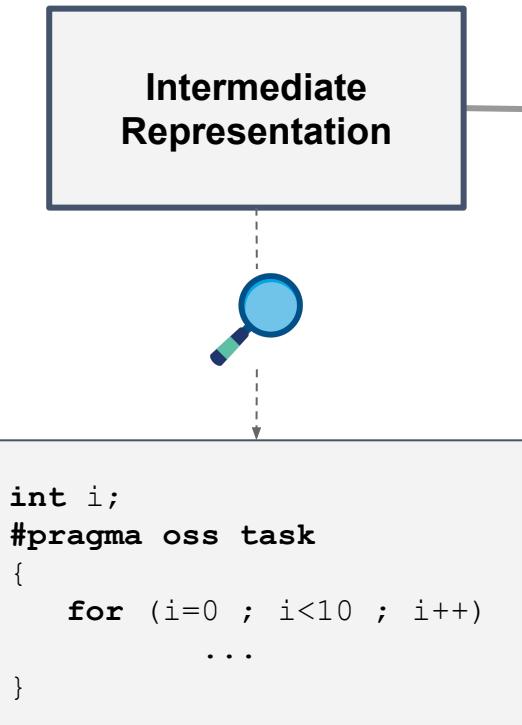


Several works tackle the automatic scope of variables in OpenMP, among others:

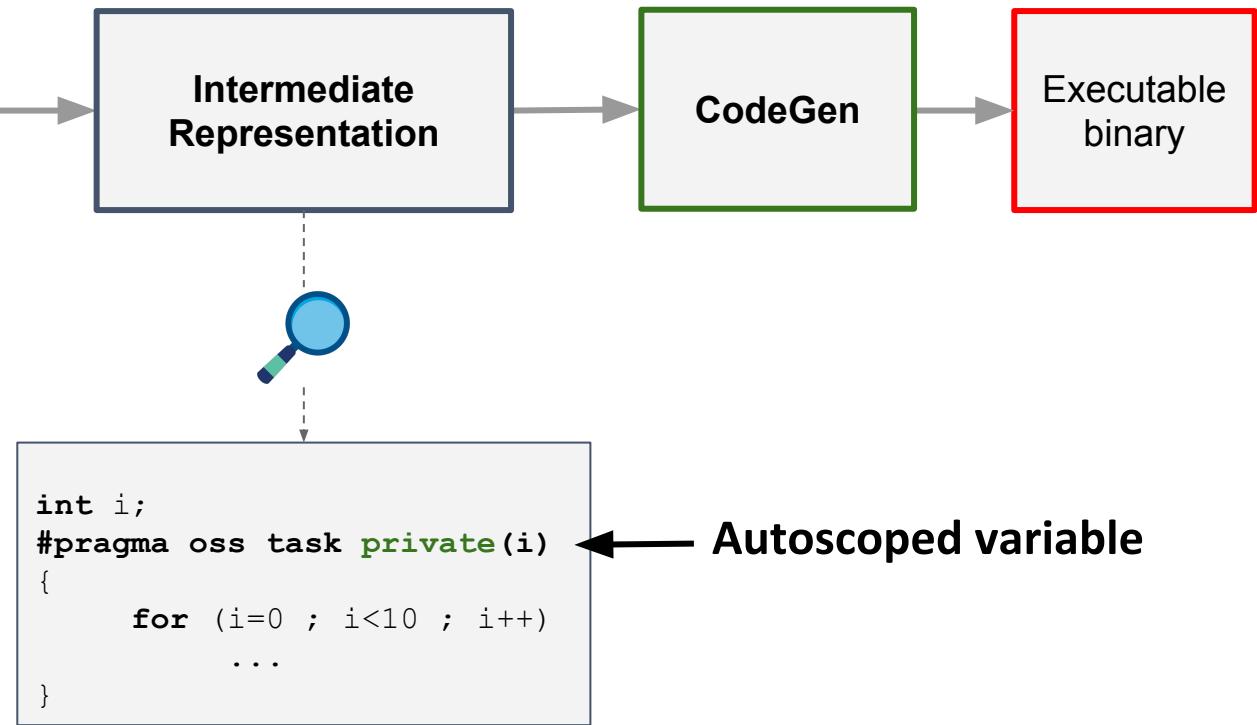
1. Lin et. al, *Automatic scoping of variables in parallel regions of an OpenMP program*, IWOMP 2004
 - a set of rules to accomplish auto-scope in parallel regions
 - obtained the same performance as user directives.
2. Royuela et. al, *Auto-scoping for OpenMP tasks*, IWOMP 2012
 - a set of rules to accomplish auto-scope in tasks obtained a 85% success
 - compared to same feature in Oracle Solaris Studio 12.3, with a 78% success
3. Wang et.al, *Automatic scoping of task clauses for the openmp tasking model*, Journal of Supercomputing, 2015
 - simpler set of rules using synchronizations between tasks
 - better success ratio, but poor performance

Auto-scope overview

Source



Modified



Autoscoping
Analysis &
Transformation

1.

Obtain Task
Synchronization Points

2.

Obtain Task
Concurrent Code

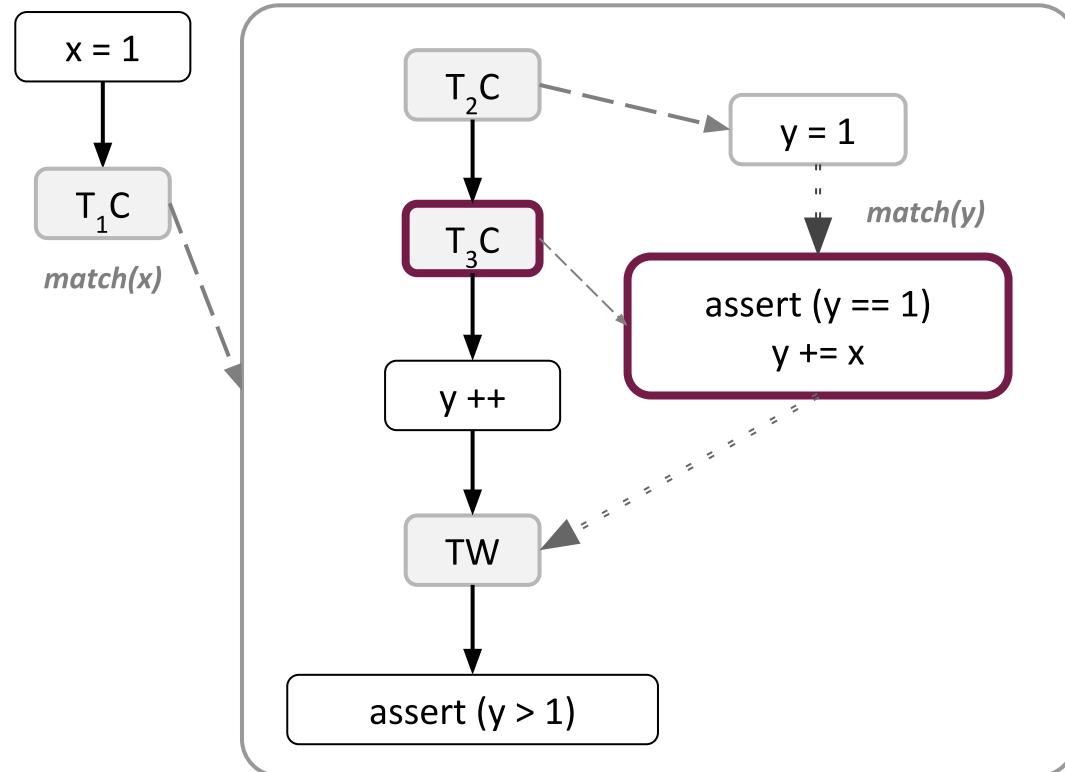
3.

Determine scope of Task
Variables



Auto-scope by example

```
1: int x = 1;
2: #pragma oss task weaken(x) out(y) label(T1)
3: {
4:     #pragma oss task out(y) label(T2)
5:     { y = 1; }
6:     #pragma oss task inout(y) in(x) label(T3)
7:     {
8:         // Here, y might be 1 or 2
9:         assert(x == 1);
10:        y += x;
11:    }
12:    y++;
13:    #pragma oss taskwait in(y)
14:    assert(y == 3);
15: }
```



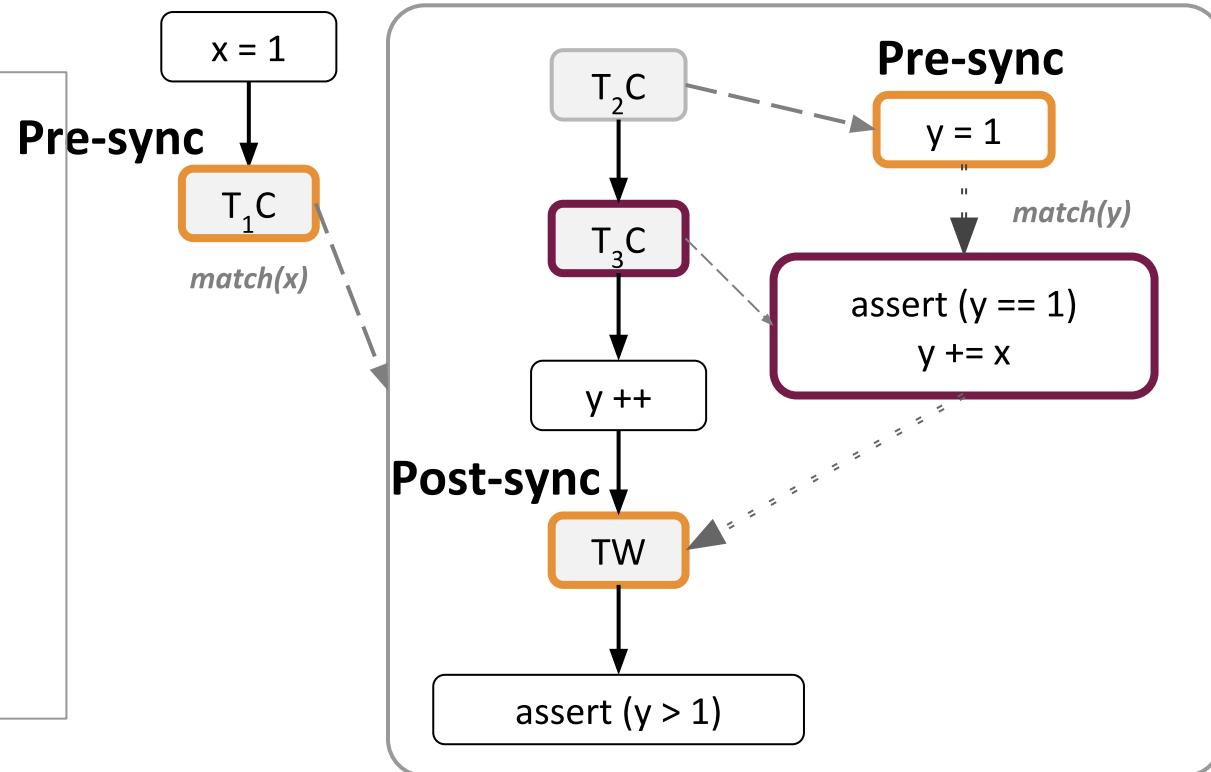
$T_x C$ Task x
creation
TW taskwait

— → Task creation
→ Flow
- - - → Synchronization

Auto-scope by example

Step 1: Synchronization points

```
1: int x = 1;
2: #pragma oss task weaken(x) out(y) label(T1)
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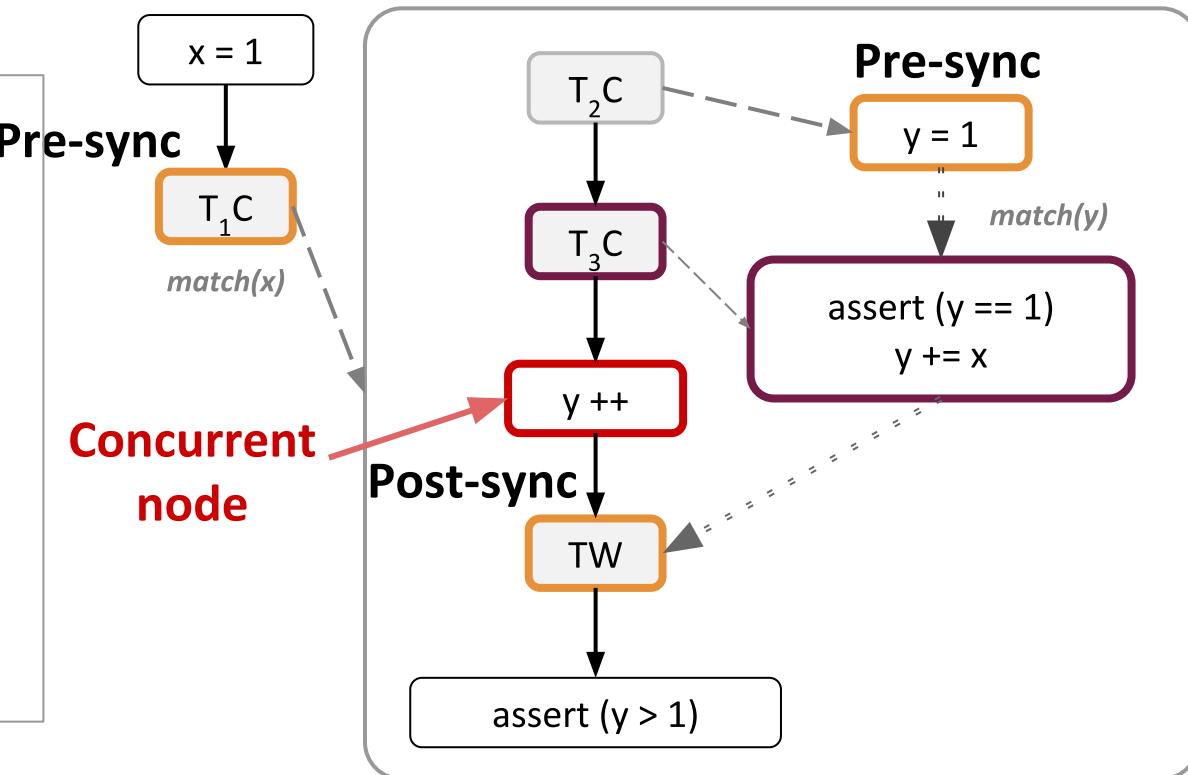
$T_x C$ Task x
creation
TW taskwait

→ Task creation
→ Flow
↔ Synchronization

Auto-scope by example

Step 2: Concurrent regions

```
1: int x = 1;
2: #pragma oss task weaken(x) out(y) label(T1)
3: {
4: #pragma oss task out(y) label(T2)
5: { y = 1; }
6: #pragma oss task inout(y) in(x) label(T3)
7: {
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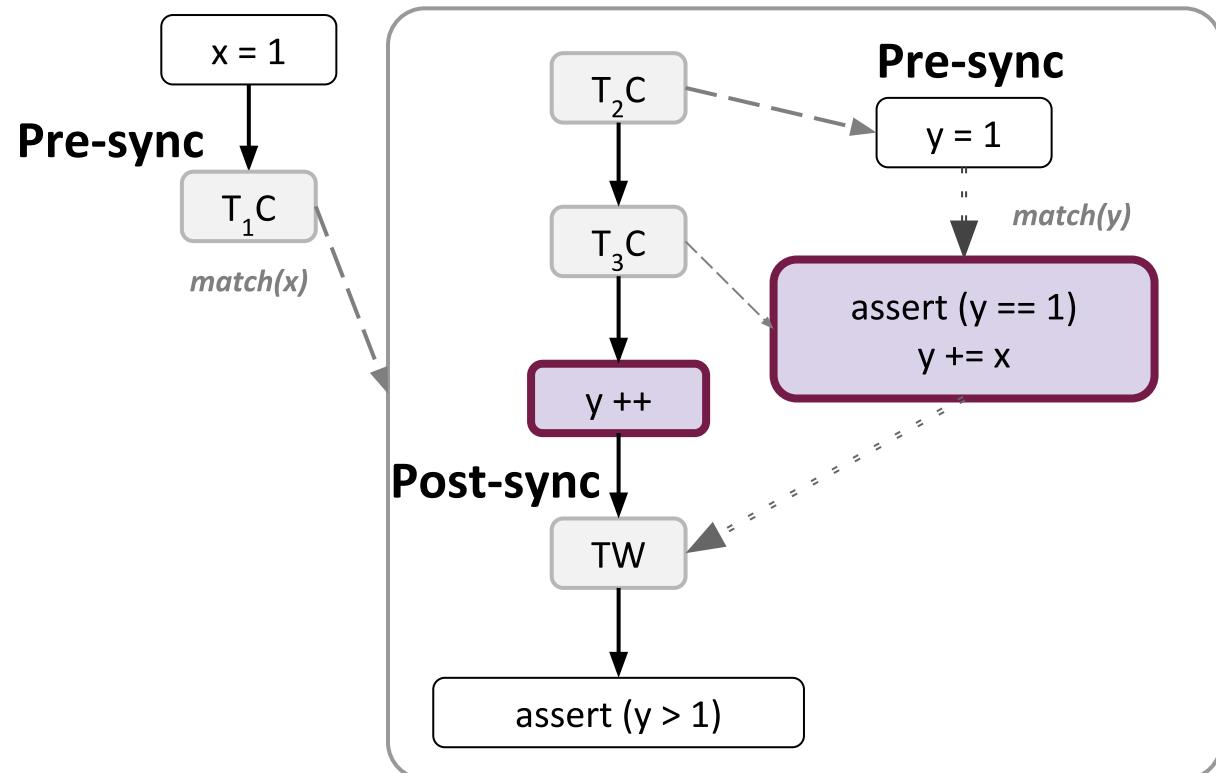
$T_x C$ Task x
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TW taskwait

→ Task creation
→ Flow
→ Synchronization

Auto-scope by example

Step 3: Final data sharings

Variable	Variables' use			
	T3		Concurrent T3	
	Read	Written	Read	Written
X	Yes	No	No	No
Y	Yes	Yes	Yes	Yes



Auto-scope by example

Step 3: Final data sharings

Variable	Variables' use			
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X	Yes	No	No	No
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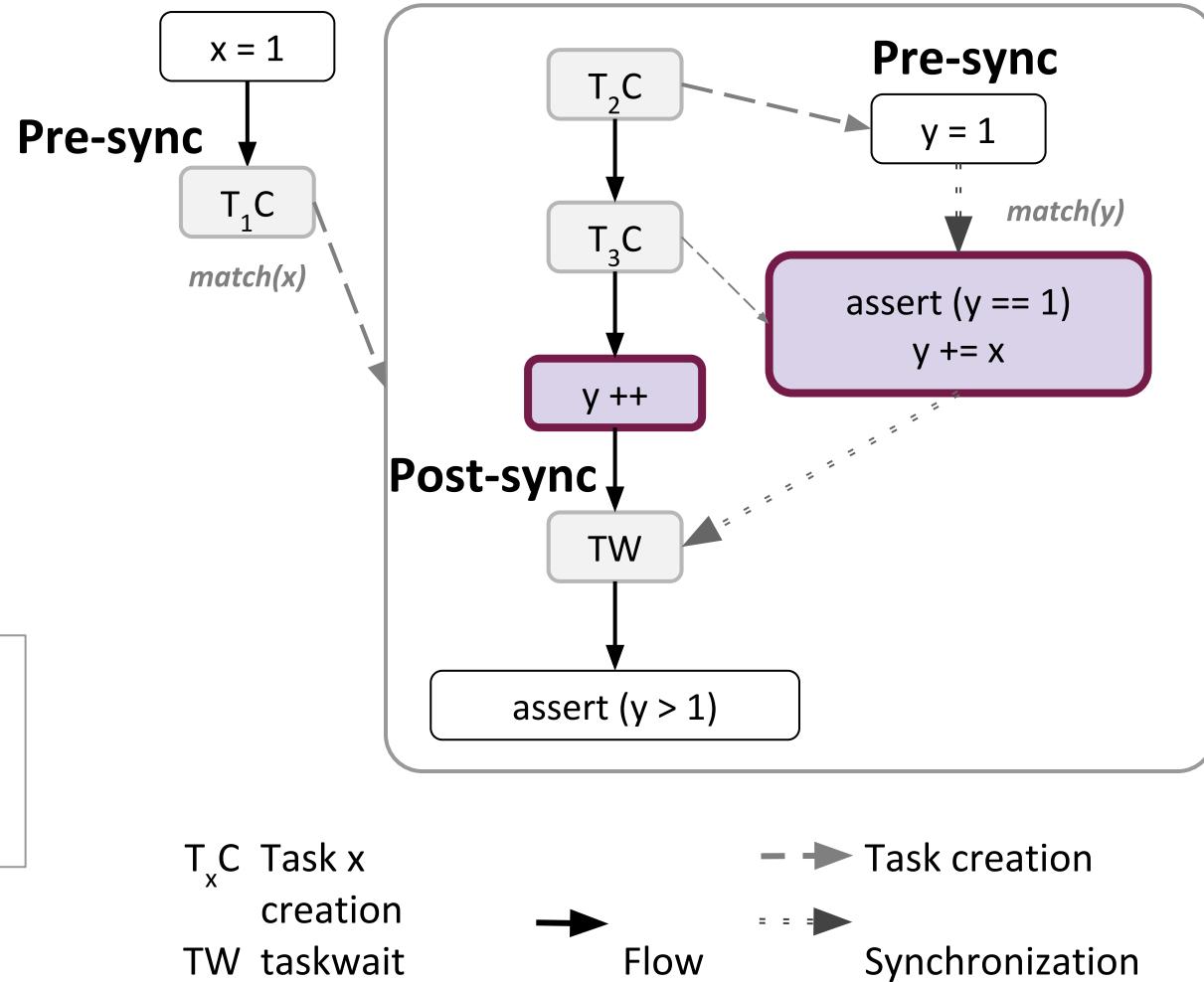
Using the set of rules as defined in:

Rouyela, S., Duran, A., Liao, C., & Quinlan, D. J.,
Auto-scoping for OpenMP tasks, IWOMP 2012

T3 data-sharing attributes:

$x \rightarrow \text{firstprivate}$

$y \rightarrow \text{race condition} \rightarrow \text{firstprivate}$



Auto-scope results

Benchmarks	Description			LLVM Results				
	#tasks	nested tasks	method	shared	private	firstprivate	undefined	(%) success
Alignment	1	no	iter	2	4	14	0	100%
FFT	41	no	rec	102	0	140	0	100%
Fib	2	no	rec	2	0	3	0	100%
Health	2	yes	iter&rec	1	1	3	0	100%
Floorplan	1	no	iter&rec	3	1	9	2	86.66%
Nqueens	1	no	iter&rec	2	0	4	0	100%
Sort	9	yes	rec	27	0	10	0	100%
SparseLU	4	yes	iter	4	3	11	0	100%
UTS	2	no	iter&rec	2	1	3	0	100%
Cholesky	4	no	iter	4	0	12	0	100%
Saxpy	2	yes	iter	4	0	3	0	100%
Matmul	2	yes	iter	3	0	8	0	100%
TOTAL								98.88%



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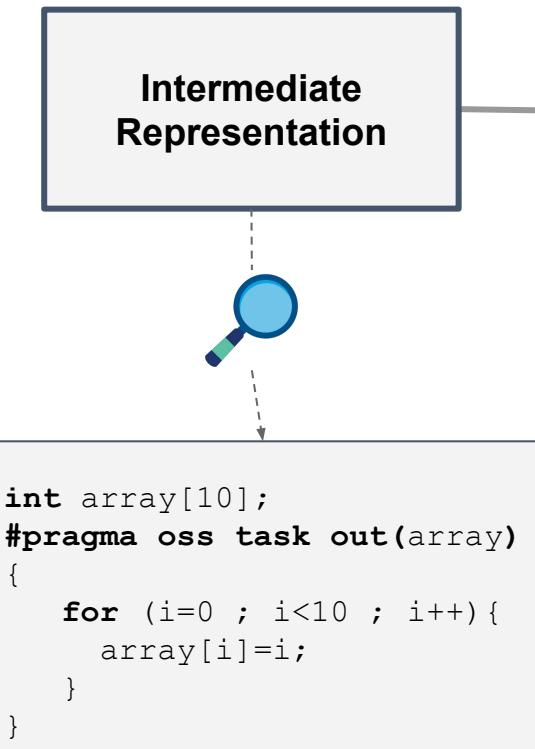
Variables used in system calls, and
not defined in the reachable code

Outline

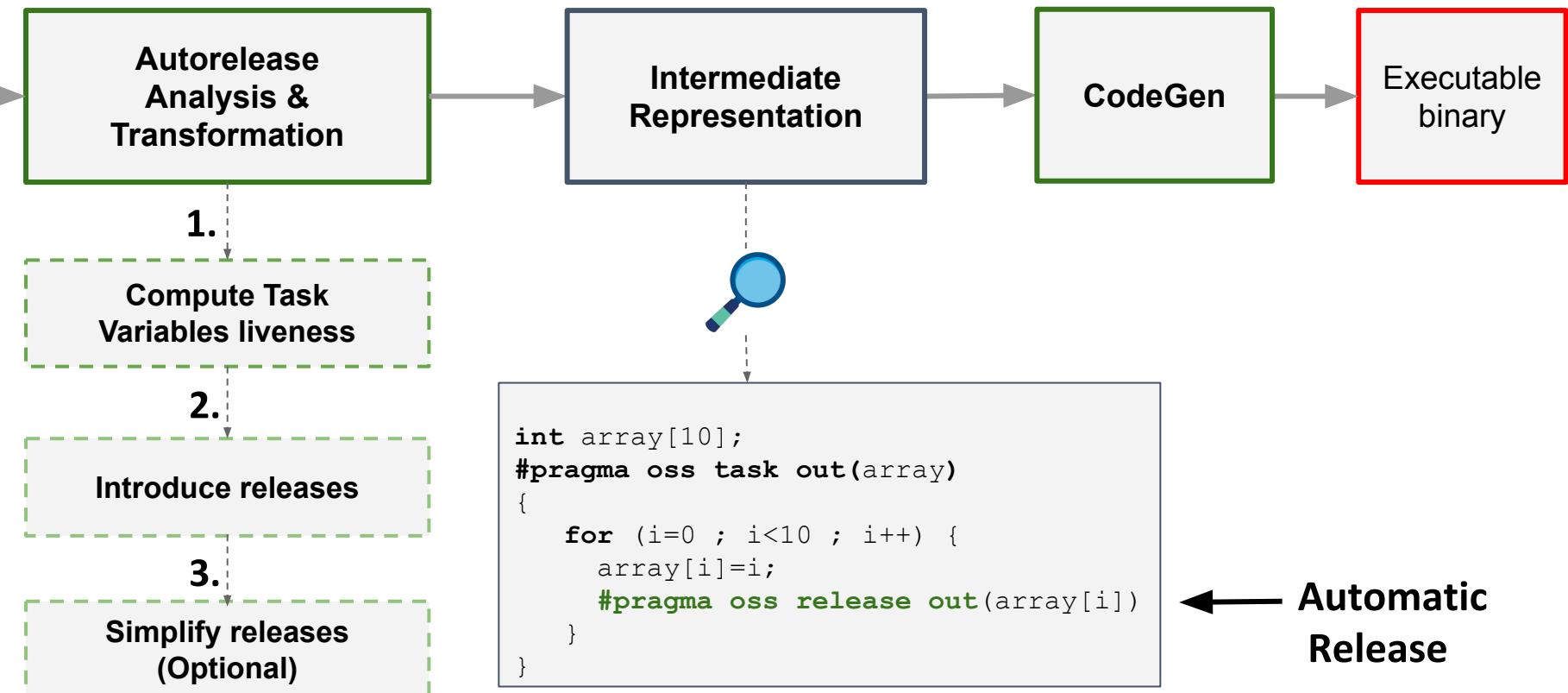
- Introduction to OmpSs-2
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Autorelease overview

Source

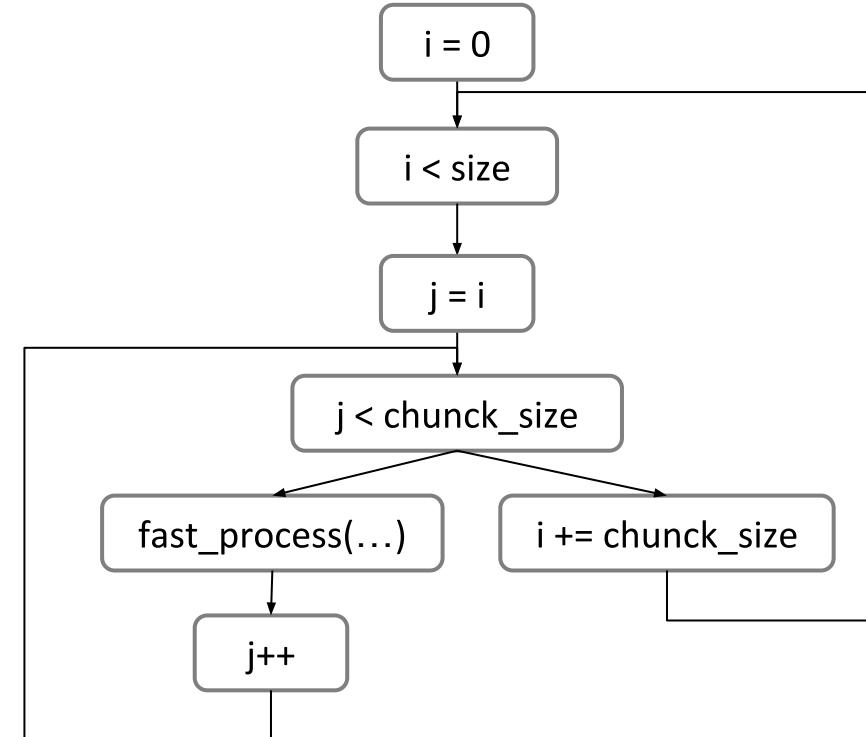
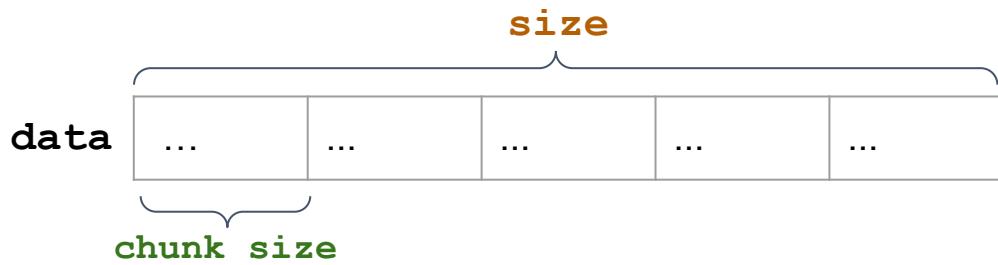


Modified



Autorelease by example

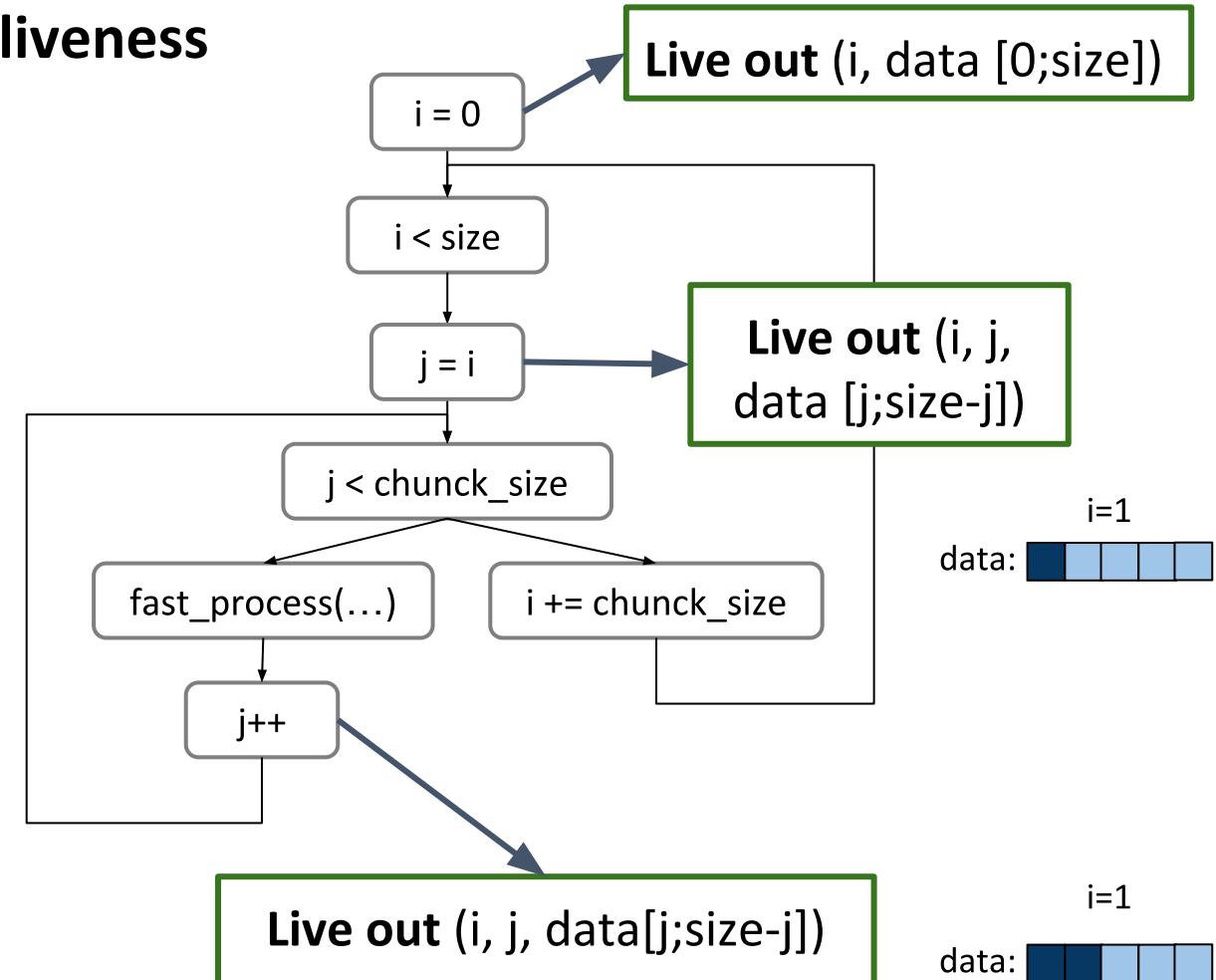
```
1: #pragma oss task out(data[0; size])
2: for (int i = 0; i < size; i += chunk_size) {
3:     // data[i;chunk_size] is used
4:     for (int j = i; j < chunk_size; j++) {
5:         fast_process(&data[j]);
6:         // data[j] is never used again
7:         // i and j are used in the
8:         // respective loop increments
9:     }
10: }
```



Autorelease by example

Compute liveness

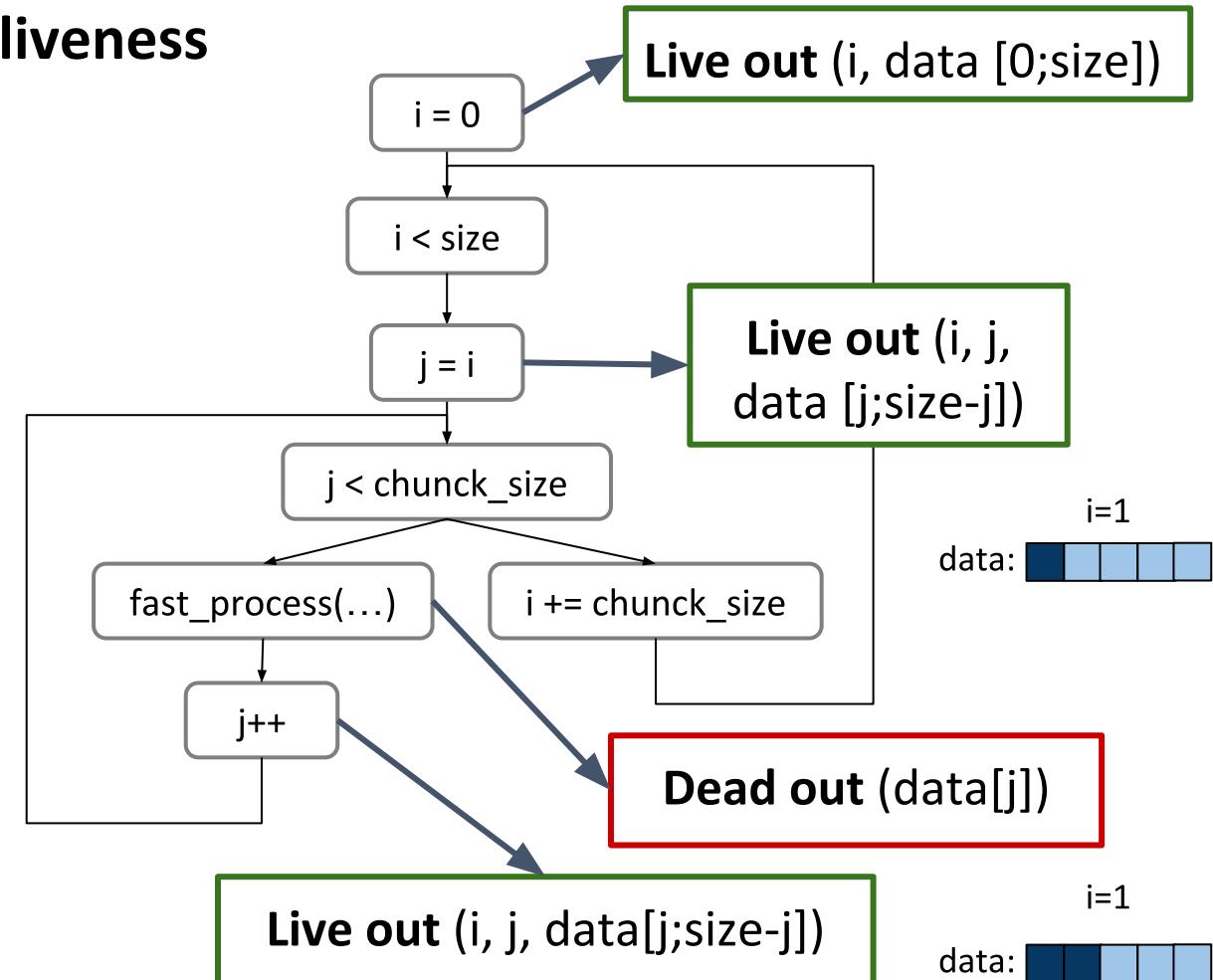
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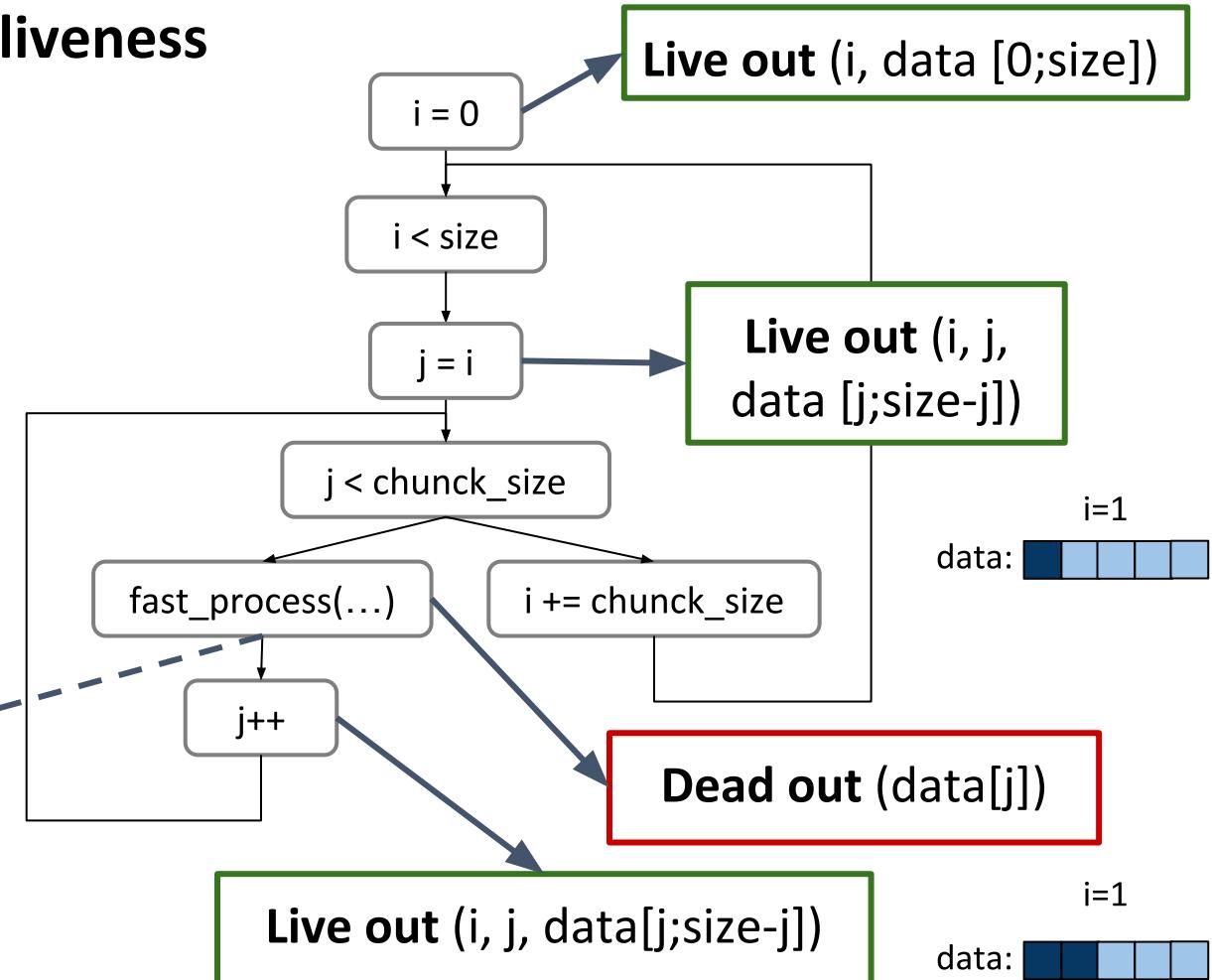
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9:         #pragma oss release (data[j]);
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Compute liveness



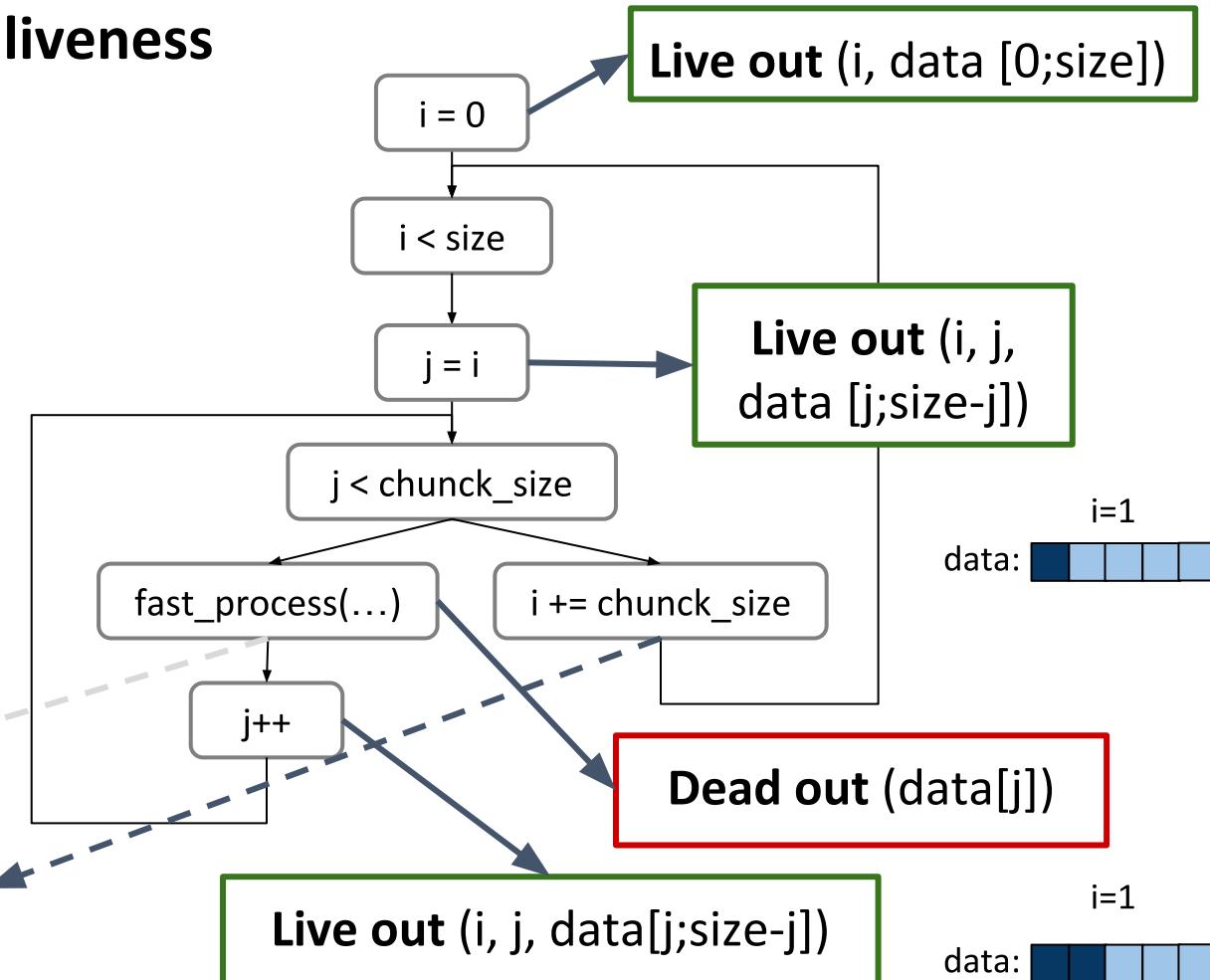
`#pragma oss release (data[j])`



Autorelease by example

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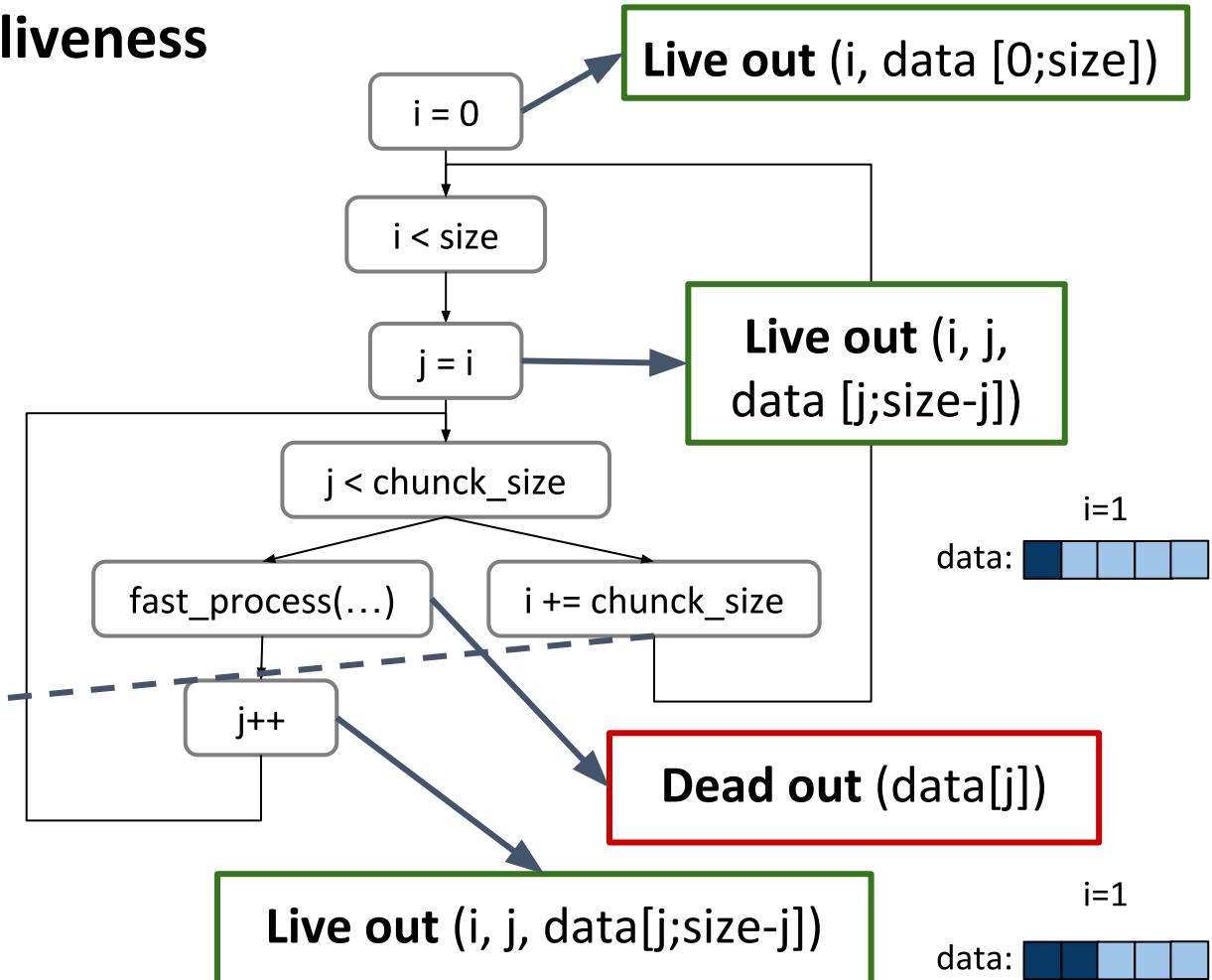
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Autorelease by example

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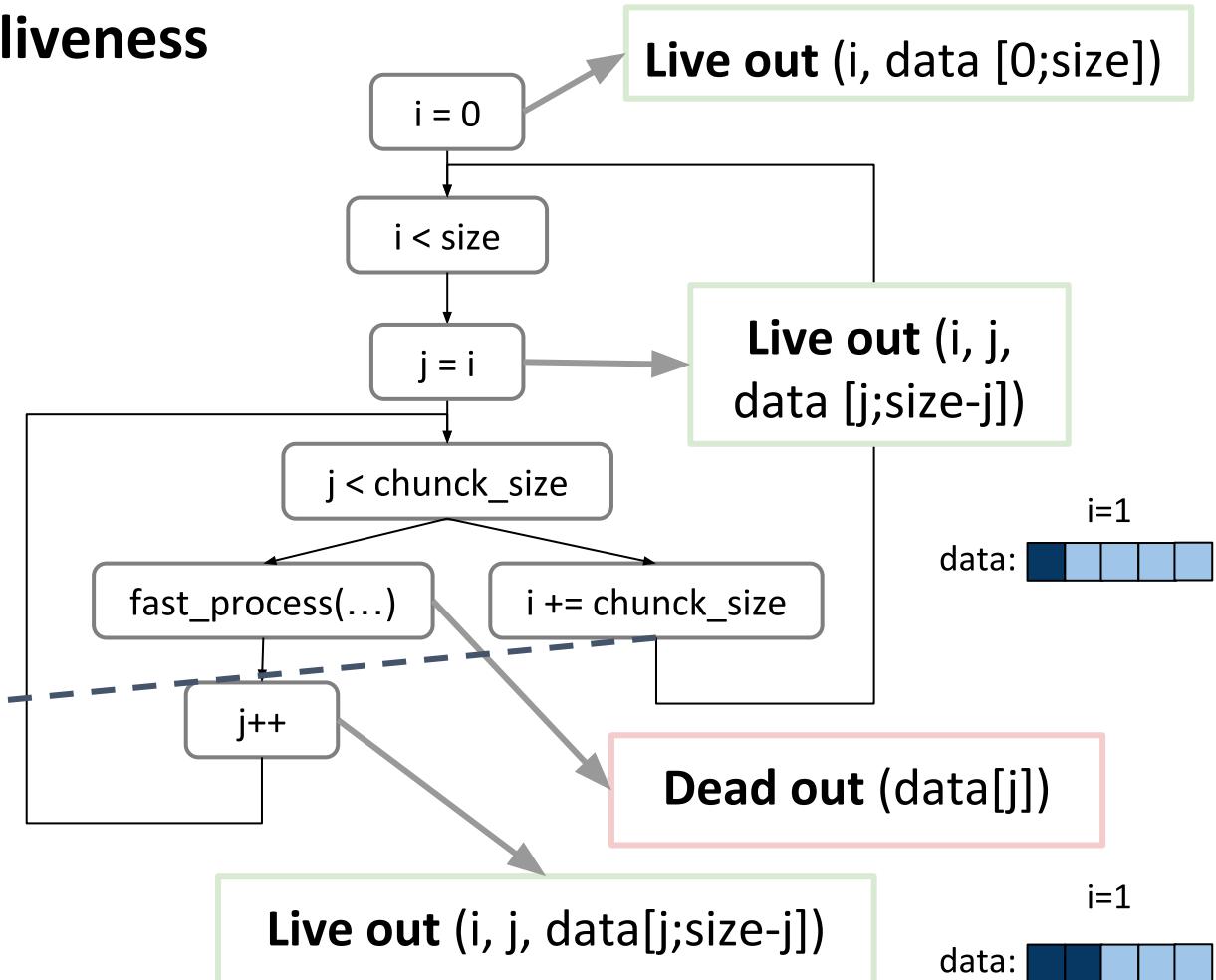
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11:    #pragma oss release (data[i;chunk_size]); outline
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```

Compute liveness



Autorelease evaluation



```
1: int data[size];
2:
3: #pragma oss task out(data[0; size]) label(T1)
4: {
5:     for (int i = 0; i < size; i += chunk_size) {
6:         for (int j = i; j < chunk_size; j++)
7:             process(&data[j]);
8:             //Release within loop (data[j])
9:     }
10:    //Release outside loop (data[i;chunk_size])
11: }
12: for (int i = 0; i < size; i += chunk_size) {
13:     #pragma oss task in(data[i; chunk_size]) label(T2)
14:     {
15:         slow_process(&data[i], chunk_size);
16:     }
17: }
```

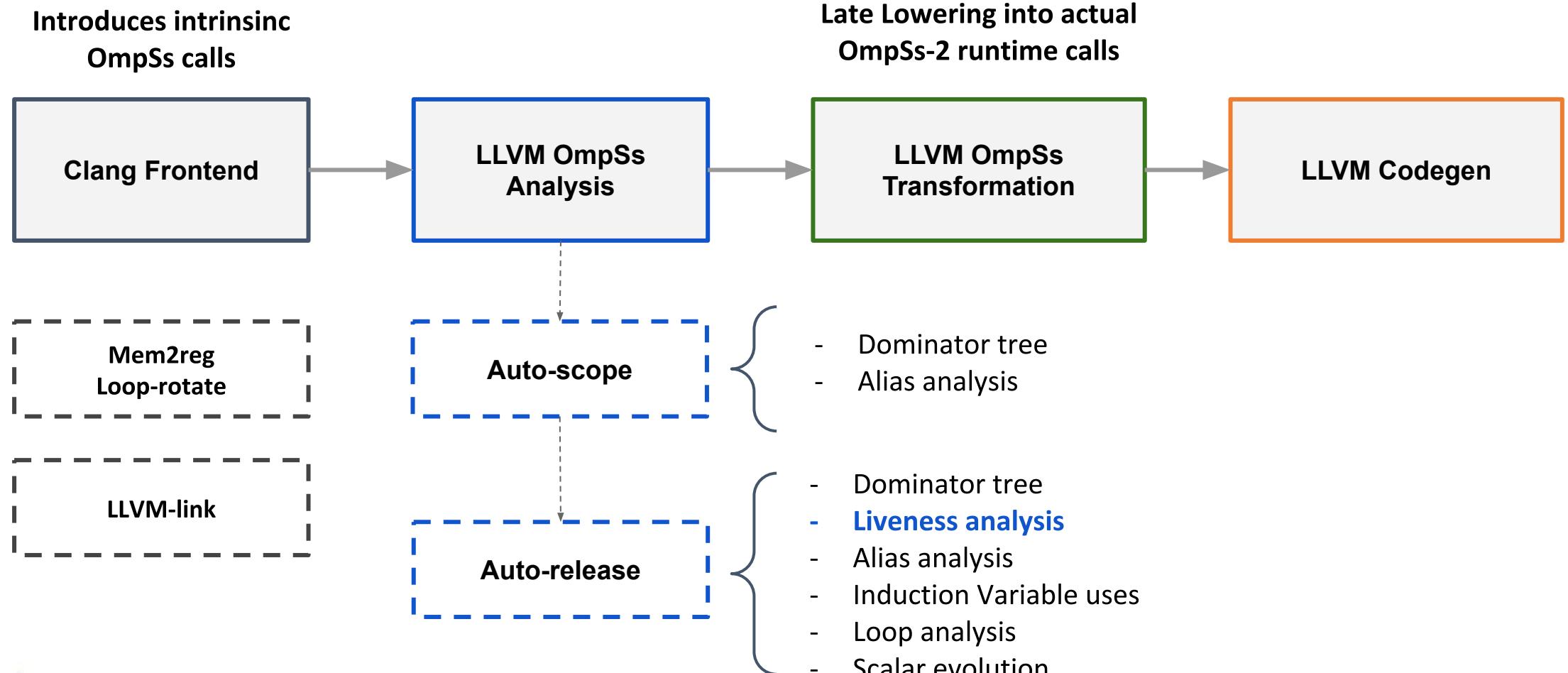
Variables		
process	Super fast process	Fast process
execution time	100 us	1000 us
size	200,000	20,000
chunk_size	10,000	1,000

Execution time (us)		
process	Super fast process	Fast process
No release	46,747,405	36,233,344
Release within loop	40,607,605	26,570,543
Release outside loop	35,894,357	26,533,354

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 - Auto-release + Evaluation
- **Implementation**
- Discussion

LLVM implementation



Outline

- Introduction to OmpSs-2
- Proposed algorithms for programmability and performance
 - Auto-scope + Evaluation
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Applicability for OpenMP

- The automatic scope of variables in task constructs can be applied for OpenMP
- Some features of OmpSs-2 are already in the newest OpenMP specifications.
 - **commutative** clause: has been introduced into the OpenMP 5.0 as *mutexinoutset*.
 - **concurrent** clause: a first preview of the OpenMP 5.1 introduces the *inoutset* clause, with the same behaviour.
- OmpSs-2 forces parent tasks to cover the dependencies of children tasks with either regular dependencies or **weak dependencies**. This restriction could be applied to OpenMP if this model is to be used in critical real-time systems.
- Others features such as the **release** clause does not exists on OpenMP but can be used for other models with similar functionality, as *DepSpawn*.

Conclusions

As a conclusion, this works tackles:

1. **Programmability:** Auto scoping the data sharings help users to hide complexity.
2. **Correctness:** Avoid possible human errors that sometimes can be difficult to track.
3. **Performance:** Improve performance introducing autorelease of dependencies.

However, remains as a future work to:

1. Simplify the release of dependencies (join contiguous accesses).
2. Automatically determine the dependency clauses (*auto-deps*).
3. Evaluate the possibilities of the OpenMP detach clause.



**Barcelona
Supercomputing
Center**
Centro Nacional de Supercomputación

Thank you

adrian.munera@bsc.es

Auto-scope rules for scalar variables

