1

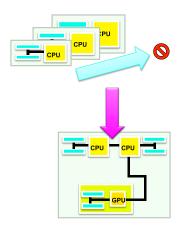
Introduction



Introduction

Parallel Multicore Architectures

- Increasingly widespread
- Increasingly dense
- Increasingly diverse
 - Specialized cores
 - Heterogeneity

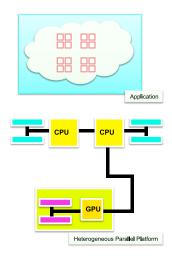




Heterogeneous Parallel Platforms

Heterogeneous Association

- General purpose processor
- Specialized accelerator





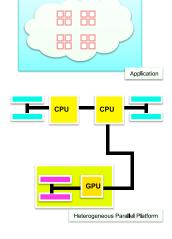
Heterogeneous Parallel Platforms

Heterogeneous Association

- General purpose processor
- Specialized accelerator

Generalization

- Combination of various units
 - Latency-optimized cores
 - Throughput-optimized cores
 - Energy-optimized cores
- Distributed cores
 - Standalone GPUs
 - Intel Xeon Phi (MIC)
 - Intel Single-Chip Cloud (SCC)
- Integrated cores
 - Intel Haswell
 - AMD Fusion
 - nVidia Tegra
 - ARM big.LITTLE

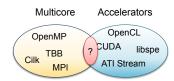


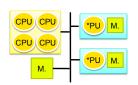


Programming Models

How to Program these architectures?

- Multicore programming
 - pthreads, OpenMP, TBB, ...
- Accelerator programming
 - Consensus on OpenCL?
 - (Often) Pure offloading model
- Hybrid models?
 - Take advantage of all resources
 - Complex interactions







Work Needed at Multiple Levels

- Applications
 - Programming paradigm
 - BLAS kernels, FFT, . . .
- Compilers
 - Languages
 - Code generation/optimization
- Runtime systems
 - Resources management
 - Heterogeneous Task scheduling
- Architecture
 - Memory interconnect



Heterogeneous Task Scheduling

Scheduling on platform equipped with accelerators

- Adapting to heterogeneity
 - Decide about tasks to offload
 - Decide about tasks to keep on CPU



Heterogeneous Task Scheduling

Scheduling on platform equipped with accelerators

- Adapting to heterogeneity
 - Decide about tasks to offload
 - Decide about tasks to keep on CPU
- Communicate with discrete accelerator board(s)
 - Send computation requests
 - Send data to be processed
 - Fetch results back
 - Expensive



Heterogeneous Task Scheduling

Scheduling on platform equipped with accelerators

- Adapting to heterogeneity
 - Decide about tasks to offload
 - Decide about tasks to keep on CPU
- Communicate with discrete accelerator board(s)
 - Send computation requests
 - Send data to be processed
 - Fetch results back
 - Expensive
- Decide about worthiness



2

StarPU Programming/Execution Models



Task Parallelism

Principles

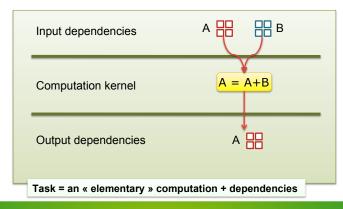
- Input dependencies
- Computation kernel
- Output dependencies



Task Parallelism

Principles

- Input dependencies
- Computation kernel
- Output dependencies





Express parallelism...



- Express parallelism...
- ... using the natural program flow



- Express parallelism...
- ... using the natural program flow
- Submit tasks in the sequential flow of the program...



- Express parallelism...
- ... using the natural program flow
- Submit tasks in the sequential flow of the program...
- ... then let the runtime schedule the tasks asynchronously



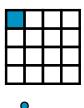
```
for (j = 0; j < N; j++) {
  POTRF (RW,A[j][j]);
  for (i = j+1; i < N; i++)
    TRSM (RW, A[i][j], R, A[j][j]);
  for (i = j+1; i < N; i++) {
    SYRK (RW,A[i][i], R,A[i][j]);
    for (k = j+1; k < i; k++)
      GEMM (RW, A[i][k],
            R,A[i][j], R,A[k][j]);
wait ():
```















```
for (j = 0; j < N; j++) {
  POTRF (RW, A[j][j]);
  for (i = j+1; i < N; i++)
    TRSM (RW, A[i][j], R, A[j][j]);
  for (i = j+1; i < N; i++) {
    SYRK (RW, A[i][i], R, A[i][j]);
    for (k = j+1; k < i; k++)
      GEMM (RW, A[i][k],
            R,A[i][j], R,A[k][j]);
wait ():
```



























































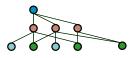




GEMM





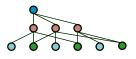




GEMM





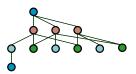




GEMM















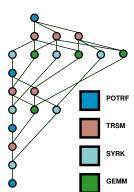














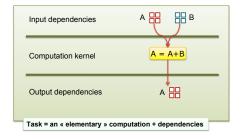
Task Relationships

Abstract Application Structure



Task Relationships

Abstract Application Structure

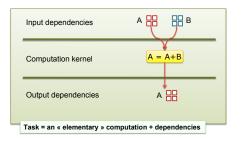


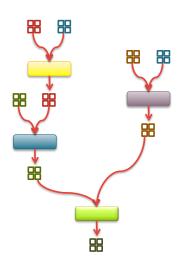


Task Relationships

Abstract Application Structure

Directed Acyclic Graph (DAG)







StarPU Execution Model: Task Scheduling

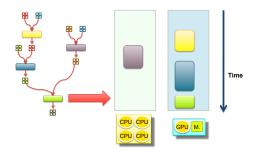
Mapping the graph of tasks (DAG) on the hardware



StarPU Execution Model: Task Scheduling

Mapping the graph of tasks (DAG) on the hardware

Allocating computing resources

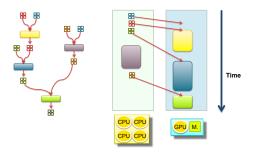




StarPU Execution Model: Task Scheduling

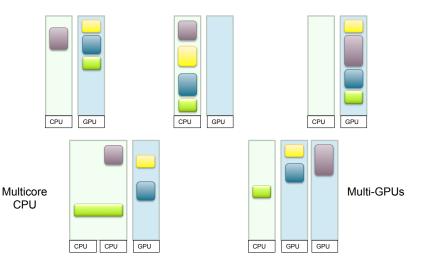
Mapping the graph of tasks (DAG) on the hardware

- Allocating computing resources
- Enforcing dependency constraints
- Handling data transfers





A Single DAG for Multiple Schedules, Platforms





StarPU in a Nutshell

Rationale

- Implement the sequential task flow programming model
- Map computations on heterogeneous computing units



StarPU in a Nutshell

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- Implement the sequential task flow programming model
- Map computations on heterogeneous computing units

Programming Model

- Task
- Data
- Relationships
 - Task ↔ Task
 - Task ↔ Data



StarPU in a Nutshell

Rationale

- Implement the sequential task flow programming model
- Map computations on heterogeneous computing units

Programming Model

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- Data
- Relationships
 - Task ↔ Task
 - Task ↔ Data

Runtime System

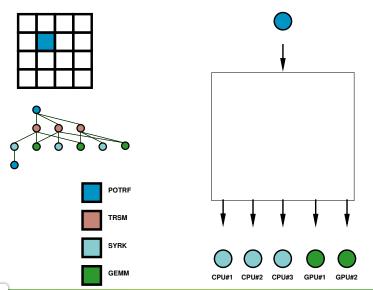
- Heterogeneous Task scheduling
- Application Programming Interface (Library)



What StarPU can do for You?

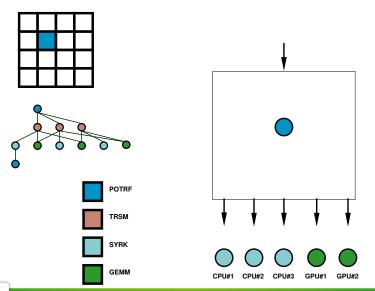


What StarPU does for You: Heterogeneous Task Scheduling



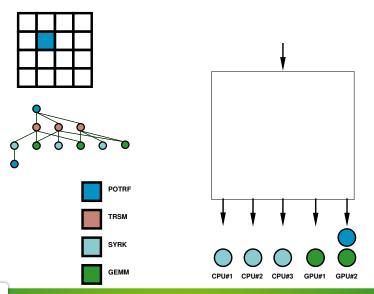


What StarPU does for You: Heterogeneous Task Scheduling





What StarPU does for You: Heterogeneous Task Scheduling





What StarPU does for You:

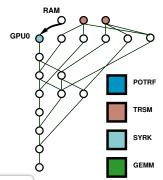


What StarPU does for You: Data Transfers



What StarPU does for You: Data Transfers



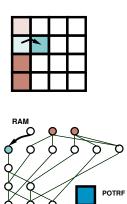


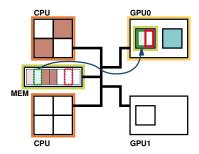


What StarPU does for You: Data Transfers

TRSM

GEMM







GPU0

3

Programming with StarPU



```
float factor = 3.14;
float vector[NX];
```



```
float factor = 3.14;
float vector[NX];
starpu_data_handle_t vector_handle;
```





```
_{1} float factor = 3.14;
float vector[NX];
3 starpu data handle t vector handle;
5 /* ... fill vector ... */
  starpu vector data register(&vector handle, 0,
                         (uintptr t) vector, NX, sizeof(vector[0]));
8
9
  starpu task insert(
10
                   &scal cl,
11
                   STARPU_RW, vector handle,
12
                   STARPU_VALUE, &factor, sizeof(factor),
13
                   0);
14
```



```
1 float factor = 3.14:
float vector[NX];
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5 /* ... fill vector ... */
  starpu vector data register(&vector handle, 0,
                        (uintptr t) vector, NX, sizeof(vector[0]));
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                   STARPU_VALUE, &factor, sizeof(factor),
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                   0);
14
15
16 starpu_task_wait_for_all();
```



```
_{1} float factor = 3.14:
float vector[NX];
3 starpu data handle t vector handle;
5 /* ... fill vector ... */
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                        (uintptr t) vector, NX, sizeof(vector[0]));
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9
  starpu task insert(
                   &scal cl.
11
                   STARPU RW. vector handle.
12
                   STARPU_VALUE, &factor, sizeof(factor),
13
                   0);
14
15
  starpu_task_wait_for_all();
  starpu_data_unregister(vector_handle);
18
19 /* ... display vector ... */
```



Terminology

- Codelet
- Task
- Data handle



- relates an abstract computation kernel to its implementation(s)
- ... can be instantiated into one or more tasks
- ... defines characteristics common to a set of tasks



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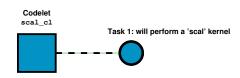


- relates an abstract computation kernel to its implementation(s)
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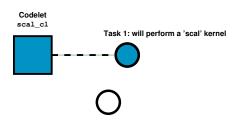


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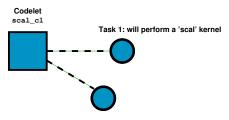


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- relates an abstract computation kernel to its implementation(s)
- ... can be instantiated into one or more tasks
- defines characteristics common to a set of tasks



Task 2: will perform a 'scal' kernel



- ... is an instantiation of a Codelet
- atomically executes a kernel from its beginning to its end
- ... receives some input
- ... produces some output



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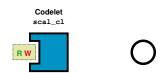


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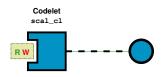


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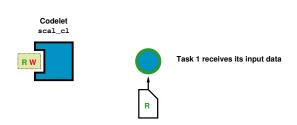


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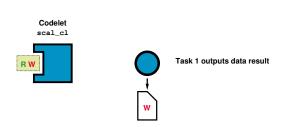


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- ... atomically executes a kernel from its beginning to its end
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Definition: A Data Handle

A Data Handle...

- ... designates a piece of data managed by StarPU
- ... is typed (vector, matrix, etc.)
- ... can be passed as input/output for a Task



Elementary API

- Initializing/Ending a StarPU session
- Declaring a codelet
- Declaring and Managing Data
- Writing a Kernel Function
- Submitting a task
- Waiting for submitted tasks



Initializing a StarPU Session

starpu_init(struct starpu_conf *configuration)



Initializing a StarPU Session

- starpu_init(struct starpu_conf *configuration)
 - The **struct starpu conf** can be used to configure StarPU settings
 - Specify NULL for default settings



Initializing a StarPU Session

- starpu_init(struct starpu_conf *configuration)
 - The **struct starpu conf** can be used to configure StarPU settings
 - Specify NULL for default settings

```
#include <starpu.h>
int ret = starpu_init(NULL);

if (ret == 0) {
    printf("StarPU_successfully_initialized\n");
} else {
    fprintf(stderr, "StarPU_initialization_failed\n");
    exit(1);
}

/* StarPU is ready */
...
```



Ending a StarPU Session

starpu_shutdown()



Ending a StarPU Session

starpu_shutdown()

```
starpu_shutdown();

/* StarPU is terminated */
...
```



Define a struct starpu_codelet

```
struct starpu_codelet scal_cl = {
    ...
};
```



Define a struct starpu_codelet

Plug the kernel functionHere: scal_cpu_func

```
struct starpu_codelet scal_cl = {
    cpu_func = { scal_cpu_func, NULL },
    ...
};
```



Define a struct starpu_codelet

- Plug the kernel function
 - Here: scal_cpu_func
- Declare the number of data pieces used by the kernel
 - Here: A single vector

```
struct starpu_codelet scal_cl = {
    cpu_func = { scal_cpu_func, NULL },
    .nbuffers = 1,
    ...
};
```



Define a struct starpu_codelet

- Plug the kernel function
 - Here: scal_cpu_func
- Declare the number of data pieces used by the kernel
 - Here: A single vector
- Declare how the kernel accesses the piece of data
 - Here: The vector is scaled in-place, thus R/W

```
struct starpu_codelet scal_cl = {
    cpu_func = { scal_cpu_func, NULL },
    .nbuffers = 1,
    .modes = { STARPU_RW },
};
```





Put data under StarPU control

Initialize a piece of data

```
float vector[NX];
/* ... fill data ... */
```



- Initialize a piece of data
- Register the piece of data and get a handle
 - The vector is now under StarPU control



- Initialize a piece of data
- Register the piece of data and get a handle
 - The vector is now under StarPU control
- Use data through the handle



- Initialize a piece of data
- Register the piece of data and get a handle
 - The vector is now under StarPU control
- Use data through the handle
- Unregister the piece of data
 - The handle is destroyed
 - The vector is now back under user control



Every kernel function has the same C prototype

```
void scal_cpu_func(void *buffers[], void *cl_arg) {
    ...
}
```



- Every kernel function has the same C prototype
- Retrieve the vector's handle

```
void scal_cpu_func(void *buffers[], void *cl_arg) {
    struct starpu_vector_interface *vector_handle = buffers[0];
    ...
}
```



- Every kernel function has the same C prototype
- Retrieve the vector's handle
- Get vector's number of elements and base pointer

```
void scal_cpu_func(void *buffers[], void *cl_arg) {
    struct starpu_vector_interface *vector_handle = buffers[0];

unsigned n = STARPU_VECTOR_GET_NX(vector_handle);
float *vector = STARPU_VECTOR_GET_PTR(vector_handle);

...
}
```



- Every kernel function has the same C prototype
- Retrieve the vector's handle
- Get vector's number of elements and base pointer
- Get the scaling factor as inline argument

```
void scal_cpu_func(void *buffers[], void *cl_arg) {
    struct starpu_vector_interface *vector_handle = buffers[0];

unsigned n = STARPU_VECTOR_GET_NX(vector_handle);
    float *vector = STARPU_VECTOR_GET_PTR(vector_handle);

float *ptr_factor = cl_arg;
...
}
```



- Every kernel function has the same C prototype
- Retrieve the vector's handle
- Get vector's number of elements and base pointer
- Get the scaling factor as inline argument
- Compute the vector scaling

```
void scal_cpu_func(void *buffers[], void *cl_arg) {
    struct starpu_vector_interface *vector_handle = buffers[0];

unsigned n = STARPU_VECTOR_GET_NX(vector_handle);

float *vector = STARPU_VECTOR_GET_PTR(vector_handle);

float *ptr_factor = cl_arg;

unsigned i;
for (i = 0; i < n; i++)
    vector[i] *= *ptr_factor;
}</pre>
```



The starpu_task_insert call

Inserts a task in the StarPU DAG



The starpu_task_insert call

Inserts a task in the StarPU DAG

Arguments

The codelet structure

```
starpu_task_insert(&scal_cl ...);
```



The starpu_task_insert call

Inserts a task in the StarPU DAG

Arguments

- The codelet structure
- The StarPU-managed data

```
starpu_task_insert(&scal_cl,
STARPU_RW, vector_handle,
...);
```



The starpu_task_insert call

Inserts a task in the StarPU DAG

Arguments

- The codelet structure
- The StarPU-managed data
- The small-size inline data

```
starpu_task_insert(&scal_cl,

STARPU_RW, vector_handle,

STARPU_VALUE, &factor, sizeof(factor),

...);
```



The starpu_task_insert call

Inserts a task in the StarPU DAG

Arguments

- The codelet structure
- The StarPU-managed data
- The small-size inline data
- 0 to mark the end of arguments

```
starpu_task_insert(&scal_cl,

STARPU_RW, vector_handle,

STARPU_VALUE, &factor, sizeof(factor),

0);
```



The starpu_task_insert call

Inserts a task in the StarPU DAG

Arguments

- The codelet structure
- The StarPU-managed data
- The small-size inline data
- 0 to mark the end of arguments

Notes

■ The task is submitted non-blockingly



The starpu_task_insert call

Inserts a task in the StarPU DAG

Arguments

- The codelet structure
- The StarPU-managed data
- The small-size inline data
- 0 to mark the end of arguments

Notes

- The task is submitted non-blockingly
- Dependencies are enforced with previously submitted tasks' data...



The starpu_task_insert call

Inserts a task in the StarPU DAG

Arguments

- The codelet structure
- The StarPU-managed data
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- The task is submitted non-blockingly
- Dependencies are enforced with previously submitted tasks' data...
- ... following the natural order of the program



The starpu_task_insert call

Inserts a task in the StarPU DAG

Arguments

- The codelet structure
- The StarPU-managed data
- The small-size inline data
- 0 to mark the end of arguments

Notes

- The task is submitted non-blockingly
- Dependencies are enforced with previously submitted tasks' data...
- ... following the natural order of the program
- This is the Sequential Task Flow Paradigm



■ Tasks are submitted non-blockingly



Tasks are submitted non-blockingly

```
/* non-blocking task submits */
starpu_task_insert(...);
starpu_task_insert(...);
starpu_task_insert(...);
...
```



- Tasks are submitted non-blockingly
- Wait for all submitted tasks to complete their work

```
/* non-blocking task submits */
starpu_task_insert(...);
starpu_task_insert(...);
starpu_task_insert(...);
...
```



- Tasks are submitted non-blockingly
- Wait for all submitted tasks to complete their work

```
/* non-blocking task submits */
starpu_task_insert(...);
starpu_task_insert(...);
starpu_task_insert(...);
...

/* wait for all task submitted so far */
starpu_task_wait_for_all();
```



Basic Example: Scaling a Vector

```
_{1} float factor = 3.14:
float vector[NX];
3 starpu data handle t vector handle;
5 /* ... fill vector ... */
  starpu vector data register(&vector handle, 0,
                         (uintptr t) vector, NX, sizeof(vector[0]));
8
9
  starpu task insert(
10
                   &scal cl.
11
                   STARPU RW. vector handle.
12
                   STARPU_VALUE, &factor, sizeof(factor),
13
                   0);
14
15
  starpu_task_wait_for_all();
  starpu_data_unregister(vector_handle);
18
19 /* ... display vector ... */
```



Heterogeneity: Device Kernels

Extending a codelet to handle heterogeneous platforms



Heterogeneity: Device Kernels

Extending a codelet to handle heterogeneous platforms

- Multiple kernel implementations for a CPU
 - SSE, AVX, ... optimized kernels



Heterogeneity: Device Kernels

Extending a codelet to handle heterogeneous platforms

- Multiple kernel implementations for a CPU
 - SSE, AVX, ... optimized kernels
- Kernels implementations for accelerator devices
 - OpenCL, NVidia Cuda kernels





```
2
  extern "C" void scal_cuda_func(void *buffers[], void *cl_arg){
      struct starpu vector interface *vector handle = buffers[0];
9
      unsigned n = STARPU_VECTOR_GET_NX(vector handle);
10
      float *vector = STARPU_VECTOR_GET_PTR(vector handle);
11
      float *ptr factor = cl arg;
12
13
14
       . . .
15
16
17
18
19
```



```
2
5
  extern "C" void scal cuda func(void *buffers[], void *cl arg){
      struct starpu_vector_interface *vector_handle = buffers[0];
9
      unsigned n = STARPU_VECTOR_GET_NX(vector handle);
10
      float *vector = STARPU_VECTOR_GET_PTR(vector handle);
11
      float *ptr factor = cl arg;
12
13
      unsigned threads per block = 64;
14
      unsigned nblocks = (n+threads per block-1)/threads per block;
15
16
17
       . . .
18
19
```



```
extern "C" void scal cuda func(void *buffers[], void *cl arg){
      struct starpu vector interface *vector handle = buffers[0];
      unsigned n = STARPU_VECTOR_GET_NX(vector handle);
10
      float *vector = STARPU_VECTOR_GET_PTR(vector handle);
11
      float *ptr factor = cl arg;
12
13
      unsigned threads per block = 64;
14
      unsigned nblocks = (n+threads_per_block-1)/threads_per_block;
15
16
      vector mult cuda <<< nblocks, threads per block, 0,
17
          starpu cuda get local stream()>>>(n, vector, * ptr factor);
18
19
```



```
static __global__ void vector_mult_cuda(unsigned n,
                                      float *vector, float factor){
2
      unsigned i = blockldx.x*blockDim.x + threadIdx.x:
3
6
  extern "C" void scal cuda func(void *buffers[], void *cl arg){
      struct starpu vector interface *vector handle = buffers[0];
      unsigned n = STARPU_VECTOR_GET_NX(vector handle);
10
      float *vector = STARPU_VECTOR_GET_PTR(vector handle);
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          starpu cuda get local stream()>>>(n, vector, * ptr factor);
18
19
```



```
static __global__ void vector_mult_cuda(unsigned n,
                                      float *vector, float factor){
2
      unsigned i = blockldx.x*blockDim.x + threadIdx.x:
      if (i < n)
          vector[i] *= factor;
5
6
  extern "C" void scal cuda func(void *buffers[], void *cl arg){
      struct starpu vector interface *vector handle = buffers[0];
      unsigned n = STARPU_VECTOR_GET_NX(vector handle);
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