

## **REPARA:** Recengineering for Heterogeneous Parallelism for Performance and Energy in $C_{++}$

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### 1 Introduction

- 2 Source code preparation
- 3 Application partitioning
- 4 Transformation analysis
- 5 From attributes to run-time

### 6 Summary

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## Context

The end for the **free-lunch** era.

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## Context

- The end for the **free-lunch** era.
- New architectures with diversity in computing elements.
   Multi-cores, GPUs, DSPs, FPGAs.

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## Context

- The end for the **free-lunch** era.
- New architectures with diversity in computing elements.
   Multi-cores, GPUs, DSPs, FPGAs.
- A switch of focus.
  - From performance centric serial computations, ...
  - ... to energy efficient parallel computations.

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## Context

- The end for the free-lunch era.
- New architectures with diversity in computing elements.
   Multi-cores, GPUs, DSPs, FPGAs.
- A switch of focus.
  - From performance centric serial computations, ...
  - ... to energy efficient parallel computations.
- Programming heterogeneous parallel architectures:
  - Lack of unified programming model for diverse devices.
  - Need to maximize performance and energy efficiency.
  - Costly development process porting to multiple devices.
  - Need to modernize existing legacy code bases.



## The REPARA Vision

### Vision

The **REPARA** project aims to help in the transformation and deployment of new and legacy applications in **parallel heterogeneous computing architectures** while maintaining balance between:

- application performance,
- energy efficiency, and
- source code maintainability.

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## A workflow for code transformations



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## Problems to be solved (I)

### Source code preparation:

- Adaptation of legacy code.
- Enforcement of C++ subset (REPARA-C++).

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## Problems to be solved (I)

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### Application partitioning:

- Describe the target platform.
- Map software components to specific computing devices.



## Problems to be solved (I)

### Source code preparation:

- Adaptation of legacy code.
- Enforcement of C++ subset (REPARA-C++).

### Application partitioning:

- Describe the target platform.
- Map software components to specific computing devices.

### Transformation analysis:

- Identify transformation opportunities.
- Generation of an Abstract Intermediate Representation (REPARA-AIR).

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## Problems to be solved (II)

### Source code transformation:

- Interactive and non-interactive refactoring.
- Automated transformation to FPGA.

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## Problems to be solved (II)

### Source code transformation:

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### Runtime engineering:

- Coordination of software components (FastFlow).
- Manage statically and dynamically partitioned applications.



## Problems to be solved (II)

### Source code transformation:

- Interactive and non-interactive refactoring.
- Automated transformation to FPGA.

### Runtime engineering:

- Coordination of software components (FastFlow).
- Manage statically and dynamically partitioned applications.

### Continuous evaluation:

- Prediction and monitoring of performance and energy.
- Evalutation of software maintainability.



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 C++ is an evolving language, but highly backwards compatible.

And it has a C subset.

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## Legacy code

- C++ is an evolving language, but highly backwards compatible.
  - And it has a C subset.
- In the context of parallel heterogeneous architectures a software component may run at:
  - Host side: Runs at the CPU.
    - Supports all the ISO C++11 features.
  - Device side: Runs on device (GPU, FPGA, DSP).
    - Restricted subset from ISO C++11.

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## **GPU: Examples**

- Forbid the use of *bit-fields* data members in structures.
- Disallow the use of VLAs and *flexible* array data members.
- GPU software components cannot use dynamic type binding.
  - virtual member functions.
  - Virtual inheritance.
- Memory management through new/delete cannot be used.
- GPU software components cannot make use of exceptions.
- Restricted version of the C++ standard library.

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## **FPGA: Examples**

- System calls are not supported.
- Pointer casting is not allowed unless it is between native C types.
- Recursive functions are not allowed.
- Arrays of pointers are supported only if each pointer points to a scalar or array of scalars.
- Dynamic memory management is not supported.

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## Cevelop: An IDE for REPARA



http://www.cevelop.com

- Based on Eclipse IDE.
- Already includes some refactorings for C/C++ improvement.
- Future versions:
  - Application partitioning.
  - Transformation analysis.
  - Source code transformation.



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## Platform descriptions

HPP-DL: A description language to represent all elements from a parallel heterogeneous platform.

JSON based.

 A platform description includes information about hardware and other platform specific information (e.g. I/O ports, IRQs, ...).

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REPARA: Reeengineering for Heterogeneous Parallelism for Performance and Energy in C++

#### - Application partitioning



## HPP-DL: example

```
/* Metainformation of HPP - DL */
" class ": "hpp".
" description ": " Human readable description ",
" version ": "1.0",
" date ": " 2014 -01 -13 10:00".
" components ":
/* Definition of harware platform */
 class ": " platform ",
"id": " platform :0".
" description ": " REPARA Reference System . X9DRG - QF (To be filled by O.E.M.)".
" model ": "X9DRG -QF",
" vendor ": " Supermicro Inc.",
" numa nodes ": 2.
" processors ": 2.
" cores ": 4,
" pu_num ": 8,
 global_mem_size ": "16 GiB",
  capabilities ": I
},
   Definition of processor 0 */
/*
{
 class ": " processor ".
```

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## Kernel anotations through attributes

- Source code can be annotated to identify kernels from an application.
  - Many of this annotations can be automatically generated.
  - May be manually refined.

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## Kernel anotations through attributes

- Source code can be annotated to identify kernels from an application.
  - Many of this annotations can be automatically generated.
  - May be manually refined.

C++ offers attributes as an alternate to traditional pragmas.

- Less verbose annotation mechanism in some situations.
- Better integration with language syntax.

### Example

```
[[rpr::kernel, rpr::target(CPU,GPU), rpr::in(A,B,n,data), rpr::out(C)]]
for (int i=0; i < n; ++i)
for (int j=0; j < i; ++j)
C[i] = A[i] * B[i] + data;</pre>
```

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## Static partitioning





## Evaluation: Transitive closure



#### - Transformation analysis

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#### - Transformation analysis



## Identifying opportunities

### Kernels can be identified:

- Manually by the programmer.
- By an automated tool.

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#### Transformation analysis



## Identifying opportunities

### Kernels can be identified:

- Manually by the programmer.
- By an automated tool.
- Identifying a kernel requires:
  - Identify input and output parameters.
  - Identify target devices where the kernel is valid.
  - Identify size parameters.
- Additionally:
  - More sophisticated properties.
  - Patterns (e.g. pipeline, farm, ...).

- Transformation analysis



## An Abstract Intermediate Representation

- Transformations of software components to multiple programming models.
  - Adopt common strategy in compiler technology: a front-end and a back-end.

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Transformation analysis



## An Abstract Intermediate Representation

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  - Adopt common strategy in compiler technology: a front-end and a back-end.

### ■ front-end:

- Identifies transformation opportunities.
- Adds meta-data to original source code.
- Generates an abstract intermediate representation.

Transformation analysis



## An Abstract Intermediate Representation

- Transformations of software components to multiple programming models.
  - Adopt common strategy in compiler technology: a front-end and a back-end.

### ■ front-end:

- Identifies transformation opportunities.
- Adds meta-data to original source code.
- Generates an abstract intermediate representation.

### back-end:

- Multiple back-ends to transform to different programming models.
- One additional back-end for FPGA.

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From attributes to run-time



## Simple kernels

```
int main() {
 constexpr size_t size_a = 256, size_b = 32;
  std::vector<long> A(size_a), B(size_b);
  [[ rpr :: kernel, rpr :: in (A[]), rpr :: out(A[]), rpr :: target (CPU)]]
 for (size_t i=0; i<A.size(); ++i)
   A[i] = F(i);
  [[ rpr :: kernel, rpr :: in (B[]), rpr :: out(B[]), rpr :: target (CPU)]]
  for (size_t i=0; i<B.size(); ++i)
    B[i] = G(i);
  [[ rpr :: kernel, rpr :: in (A[], B[]), rpr :: out(x), rpr :: target (CPU)]]
  long x = H(A,B);
 std::cout << x << std::endl:
  return 0;
}
```

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## Transformation of simple kernels

```
int main() {
 constexpr size_t size_a = 256, size_b = 32;
 std::vector<long> A(size_a), B(size_b);
  ff :: ParallelFor pf;
 pf. parallel_for (0, A.size(), [&A](long i) {
   A[i] = F(i);
 });
 pf. parallel_for (0, B.size(), [&B](long i) {
   B[i] = G(i);
 });
 long x = H(A,B);
 std::cout << x << std::endl;
 return 0:
```

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## **++**

## Matrix Vector multiplication

```
int main() {
 vector < float> M(16*1024), V(1024), R(16);
  [[ rpr :: kernel, rpr :: out(M[16*1024]), rpr :: target(CPU)]]
 for (size_t i=0; i<16; ++i)
   for (size_t i=0; i<1024; ++i)
      M[i*1024+i] = static_cast < float > (i*1024+i+1);
  [[ rpr :: kernel, rpr :: out(V[1024]), rpr :: target(CPU)]]
 for (size_t i=0; i<1024; ++i) V[i]=1.0;
  [[ rpr :: kernel, rpr :: in (M[16*1024], V[1024]), rpr :: out(R[16]), rpr :: target (GPU)]]
 for (size_t i=0; i<16; ++i) {
    float sum = 0.0:
   for (size_t j=0; j<1024; ++j)
      sum += M[i*1024+j] * V[j];
   R[i] = sum;
```

print\_result (R,16);

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### Pipelines

```
...
[[ rpr :: pipeline, rpr :: stream(B,C)]]
for (size_t y=0; y<MAX; ++y) {
  [[ rpr :: kernel, rpr :: out(B[]) ]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
      B[i*N+i] = v + float{i+i}:
  [[ rpr :: kernel, rpr :: in (B[]), rpr :: out(C[]) ]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
      for (size_t k=0: i < N: ++k)
        C[i*N+i] = A[i*N+k] * B[k*N+i]
  [[ rpr :: kernel, rpr :: in (C[]), rpr :: out(R[]) ]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
       R[i*N+i] = C[i*N+i]
```

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## **++**

### Farm

```
[[ rpr :: pipeline, rpr :: stream(B,C)]]
for (size_t y=0; y<MAX; ++y) {
  [[ rpr :: kernel, rpr :: out(B[]), rpr :: farm(2) ]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
      B[i*N+i] = v + float{i+i}:
  [[ rpr :: kernel, rpr :: in (A[], B[]), rpr :: out(C[]), rpr :: farm()]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
      for (size_t k=0; i < N; ++k)
        C[i*N+i] = A[i*N+k] * B[k*N+i]
  [[ rpr :: kernel, rpr :: in (C[]), rpr :: out(R[]) ]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
       R[i*N+i] = C[i*N+i]
}
```

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### Map

```
[[ rpr :: pipeline, rpr :: stream(B,C)]]
for (size_t y=0; y<MAX; ++y) {
  [[ rpr :: kernel, rpr :: out(B[]), rpr :: map(2)]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
      B[i*N+i] = v + float{i+i}:
  [[ rpr :: kernel, rpr :: in (A[], B[]), rpr :: out(C[]), rpr :: map()]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
      for (size_t k=0; i < N; ++k)
        C[i*N+i] = A[i*N+k] * B[k*N+i]
  [[ rpr :: kernel, rpr :: in (C[]), rpr :: out(R[]) ]]
  for (size_t i=0; i<N; ++i)
    for (size_t i=0; i<N; ++i)
       R[i*N+i] = C[i*N+i]
}
```

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## Reductions

```
long r = std :: numeric_limits < long > ::min();
```

```
[[ rpr ::kernel, rpr :: in (A[]), rpr :: reduce(max,r)]]
for (size_t i=0; i<N; ++i)
r = std :: max(A[i], r);</pre>
```

```
std::cout << r << std::endl;</pre>
```

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## Asynchronous execution

```
[[rpr::kernel, rpr::async]]
for (size_t i=0;i<N; ++i)
for (size_t j=0; j<N; ++j) {
    A[i*N+j] = float{i+j};
    B[i*N+j] = float{abs(j-i)};
}</pre>
```

```
[[rpr::kernel, rpr::async]]
for (size_t i=0; i<N; ++i) V[i] = float{i};</pre>
```

```
[[rpr::sync]] ; // Explicit sync
```

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## Asynchronous execution

```
[[rpr::kernel, rpr::async]]
for (size_t i=0; i<N; ++i) V[i] = float{i};</pre>
```

```
[[ rpr :: kernel ]] // Implicit sync
f();
```

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#### Summary



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#### - Summary



## Summary

- Performance, energy efficiency and source code maitainability need to be balanced.
- Legacy code needs to be considered.
  - Much more legacy code than new code out there.
- Refactoring C++ code to:
  - Enforce specific device rules.
  - Apply transformations to specific programming models.
  - Generate FPGA code.
- Application partitioning using HW description, kernel measurements and code.
- Transformation combining front-end and back-end.
- C++ attributes to enrich code with annotations.

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