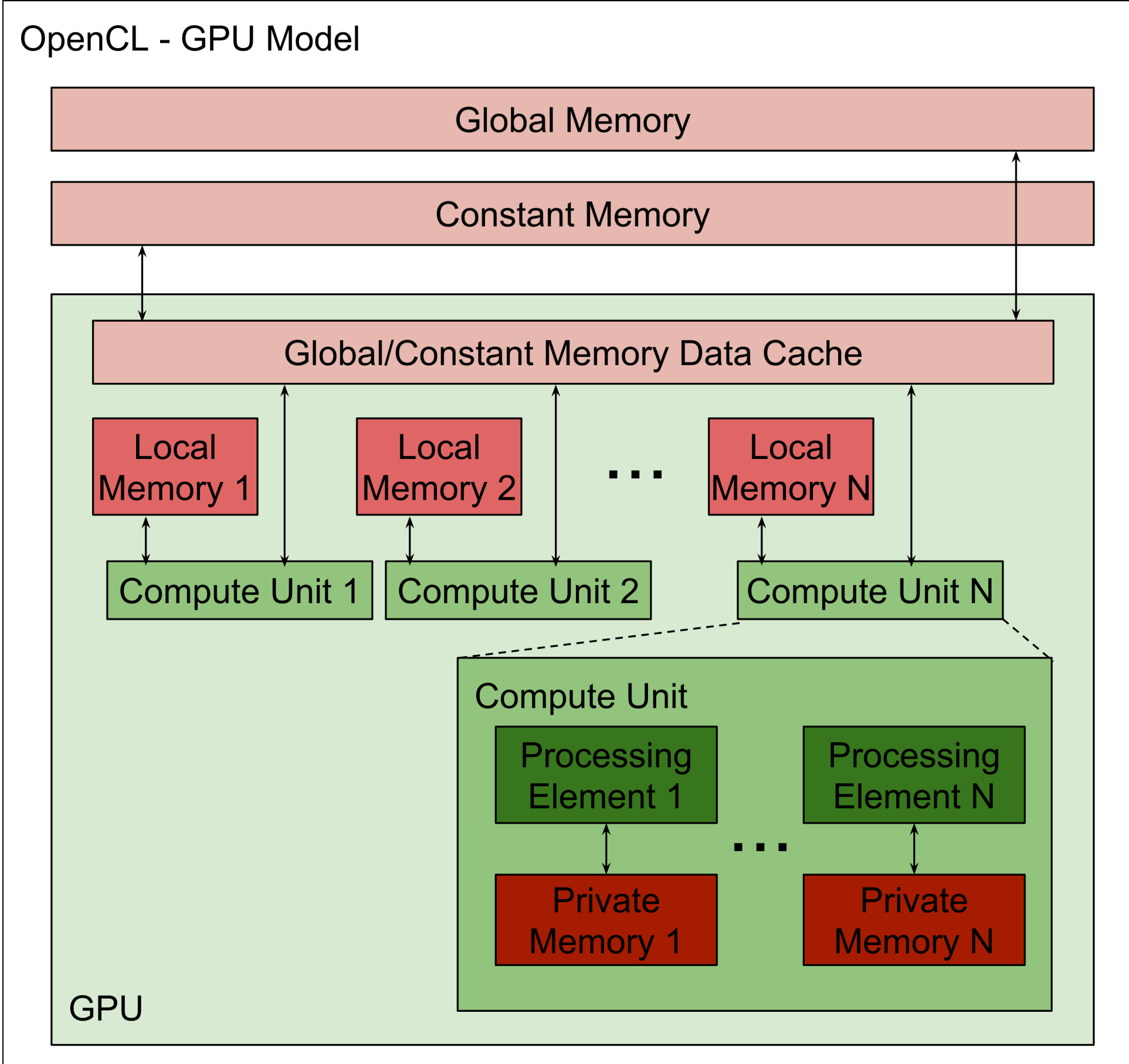


# CLTestCheck: Measuring Test Effectiveness for GPU Kernels

Chao Peng, Ajitha Rajan  
School of Informatics, University of Edinburgh, UK



## Motivation

- Writing correct GPU programs is challenging due to the huge number of threads clustered into **work-groups** and the **three-level memory hierarchy**.
- Existing work focuses on program verification by static and dynamic code analysis.
- There exist no means of measuring effectiveness of tests developed for GPU kernels.

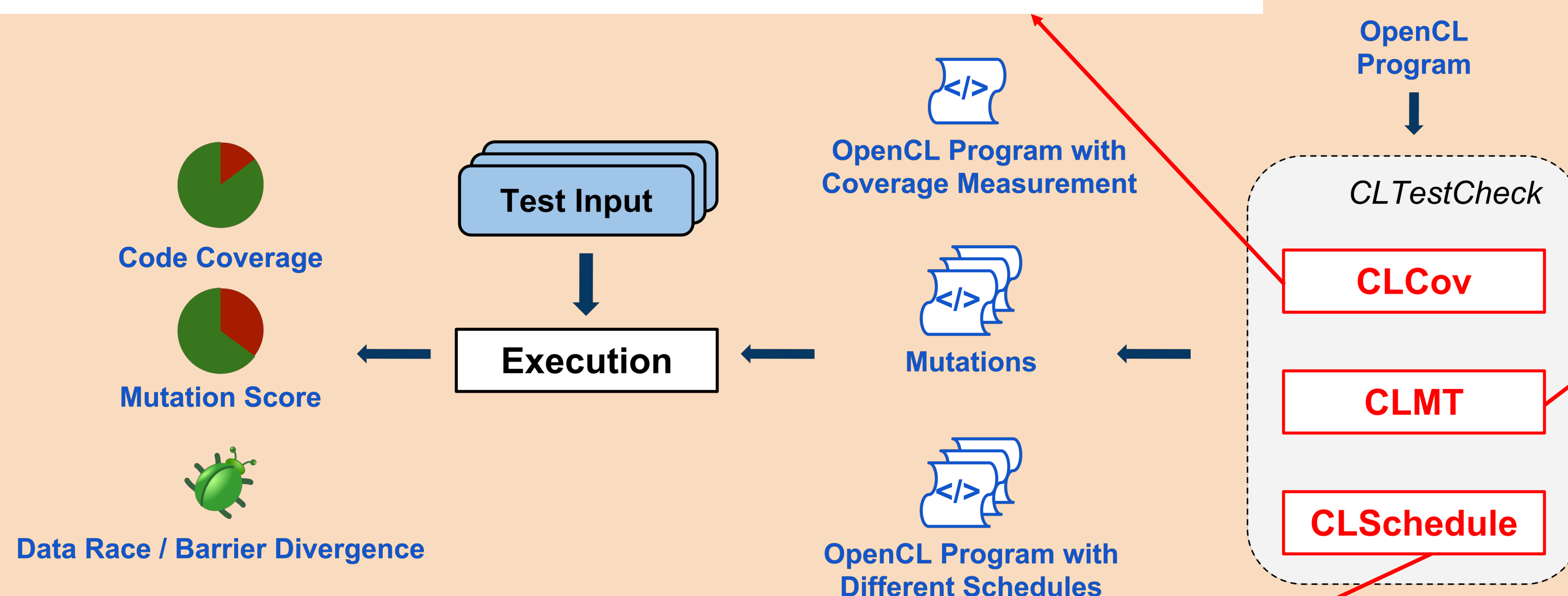
## Contributions

- Definition of three OpenCL code **coverage metrics** inspired by real faults.
- Automate **measuring code coverage** achieved by test suites.
- Automate **measuring fault finding** capability of test suites.
- Work-group **schedule amplifier** to check for potential deadlocks and data races with a given test suite that may be caused by inter work-group dependencies.

## Our Approach

### Code Coverage Measurement

Coverage criteria: *Branch Coverage, Loop Boundary Coverage, Barrier Coverage*  
The framework automatically instruments the GPU program and code coverage is recorded by the inserted data structure and code blocks.



### Fault Seeding

The framework generates mutations using:

- **Operator mutants:** mutating arithmetic, relational, bitwise, logical and assignment operators;
- **Barrier mutants:** deleting barrier function call;
- **Image coordinate mutants:** changing coordinates of image accesses;
- **Loop boundary mutants:** changing the boundary value in loop conditions.

### Schedule Amplification

- We implemented the first OpenCL *Schedule Amplifier* to generate different work-group schedules.
- In each schedule, one work-group is selected to execute first and when it finishes execution, other work-groups are enabled to proceed.
- The selected work-group ID is uniformly distributed in the space of work-groups.

## Case Studies

4 industry standard OpenCL benchmark suites:

- Parboil
- Rodinia
- Scan
- PolyBench

Totaling 82 OpenCL kernels.

## Results

- CLTestCheck is able to automatically measure coverage achieved by test inputs and reveal uncovered code blocks that may need further verification.
- CLTestCheck is able to automatically generate different types of mutations. Fault finding and total coverage were highly correlated for these benchmarks.
- Schedule amplification revealed data races in two subject programs.



Chao Peng  
chao.peng@ed.ac.uk  
chao-peng.github.io



Ajitha Rajan  
arajan@ed.ac.uk  
homepages.inf.ed.ac.uk/arajan/



THE UNIVERSITY of EDINBURGH  
**informatics**