## Codee Training Series April 26-27, 2022





#### **Shift Left Performance**

Automated Code inspection for Performance

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### **First: Introduction to Codee - Shift Left Performance**

#### **#1** Introduction to Codee tools: Shift Left Performance

- Introduction to Codee and the **shift left** approach
- **Open catalog of coding rules for performance** optimization
- Automated code inspection with Codee: Discover and Adopt
- Quick start to Codee: Canny image processing
- Hands-on: **Optimizing PI** on Perlmutter

Format:

• Remote lectures (~30'), demos. and hands-on sessions

#### Software Size and Complexity continues to grow Faster than Ever

The ability of the software to make time-sensitive decisions is key



Source: https://www.uswitch.com/guides/car-insurance/data-security-in-connected-cars/

### **Need for New Developer Tools to Shift Left Performance**

The ability of software developers to write code that runs fast on modern hardware is key



## Anyone Developing in C/C++ is a Candidate to Adopt Codee

Opportunities are extensive across many market verticals

| Market                              | Audio<br>encoding | Compression | Simulation       | Image<br>processing | Video<br>encoding | Bio informatics      | Astro physics | 5G networks     | Maths<br>kernels | Simulation<br>CFD |
|-------------------------------------|-------------------|-------------|------------------|---------------------|-------------------|----------------------|---------------|-----------------|------------------|-------------------|
|                                     | МРЗ               | UNZIP       | SPEC<br>CPU 2017 | CANNY               | FFMPEG            | GROMACS              | HACCmk        | Linux<br>Kernel | MATMUL           | NASA<br>NPB       |
| Automotive                          |                   |             |                  |                     |                   |                      |               |                 |                  |                   |
| Telecommunications                  |                   | R           |                  |                     |                   |                      |               |                 |                  |                   |
| MilAero<br>drone                    |                   |             |                  | Ú,                  |                   |                      |               |                 | Í,               |                   |
| Consumer electronics                |                   |             |                  |                     |                   |                      |               |                 |                  |                   |
| High Performance<br>Computing (HPC) |                   |             |                  |                     |                   | 」<br>回               |               |                 |                  | 」<br>国            |
|                                     | láma              | 7 zip       | spec*            |                     | $\square$         | <b>GROMACS</b> FREED | A.            | $\bigcirc$      | MATMUL           | NASA              |

#### **Benefits**



Deliver faster applications for modern low-power hardware



Save costs in software development



Integrate a repeatable, scalable and robust solution into the development workflow



Shift Left Performance

#### Automated Code Inspection For Performance

### **Performance Optimization Roadmap using Codee**

- Steps you need to take to get the maximum performance out of your C/C++ application.
- Optimization areas are ultimately the same on any type of processor, namely:
  - Memory traffic control
  - Vectorization
  - Multi-threading
- However, tuning your C/C++ code for a given type of processor may require focus on specific areas.
- Codee assists the developer in writing hardware-friendly C/C++ code that runs efficiently on any type of processor.
- Codee supports the programming techniques required at any step of the performance optimization roadmap.

| Step | Programming techniques specialized in performance |
|------|---|
| 1    | Sequential scalar optimization                    |
| 2    | Sequential control flow optimization              |
| 3    | Sequential memory optimization                    |
| 4    | Vectorization                                     |
| 5    | Multi-threading                                   |
| 6    | Offloading  |

### **Open Catalog of Coding Rules for Performance**

#### https://www.codee.com/knowledge/

#### **Recommendations (40)**

**PWR001**: Declare global variables as function parameters **PWR002**: Declare scalar variables in the smallest possible scope **PWR003**: Explicitly declare pure functions **PWR004**: Declare OpenMP scoping for all variables

**Opportunities (3) OPP001**: Multi-threading opportunity **OPP002**: SIMD opportunity **OPP003**: Offloading opportunity

#### Defects (11)

PWD002: Unprotected multithreading reduction operation
PWD003: Missing array range in data copy to the GPU
PWD004: Out-of-memory-bounds array access
PWD005: Array range copied to or from the GPU does not cover the used range

#### Remarks (14)

**RMK001**: Loop nesting that might benefit from hybrid parallelization using multithreading and SIMD **RMK002**: Loop nesting that might benefit from hybrid parallelization using offloading and SIMD **RMK003**: Potentially privatizable temporary variable

Glossary (22)

Locality of Reference Loop fission Loop interchange Loop sectioning Loop tiling Loop unswitching Loop-carried dependencies Memory access pattern Multithreading Offloading

### Navigating the Open Catalog by Stage of the Roadmap

#### https://www.codee.com/knowledge/

| Sequential optimizations  | SIMD/Vector execution  | Multi-threaded execution  | Offloading to accelerators  |
|---|--|---|---|
| <ul> <li>PWR001: Declare global variables as function parameters</li> <li>PWR002: Declare scalar variables in the smallest possible scope</li> <li>PWR003: Explicitly declare pure functions</li> <li>PWR004: Declare OpenMP scoping for all variables</li> <li>PWR007: Disable implicit declaration of variables</li> <li>PWR007: Disable implicit declaration of variables</li> <li>PWR008: Declare the intent for each procedure parameter</li> <li>PWR010: Avoid column-major array access in C/C++</li> <li>PWR012: Pass only required fields from derived data types as parameters</li> <li>RMK004: Avoid strided array access to improve performance</li> <li>RMK005: Avoid non-consecutive array access to improve performance</li> <li>RMK006: Avoid indirect array access to improve performance</li> </ul> | <ul> <li>PWR017: Transform while into for loop in order to allow vectorization</li> <li>PWR018: Call to recursive function within a loop may inhibit vectorization</li> <li>PWR019: Consider interchanging loops to favor vectorization by maximizing inner loop's trip count</li> <li>PWR020: Consider loop fission to enable vectorization</li> <li>PWR021: Temporary computation can be extracted to a vectorizable loop</li> <li>PWR022: Move invariant conditional out of the loop to facilitate vectorization</li> <li>PWR023: Add 'restrict' for pointer function parameters to hint the compiler that vectorization is safe</li> </ul> | <ul> <li>PWR006: Avoid privatization of read-only variables</li> <li>PWD001: Invalid OpenMP multithreading datascoping</li> <li>PWD002: Unprotected multithreading reduction operation</li> <li>PWD004: Out-of-memory-bounds array access</li> <li>PWD007: Unprotected multithreading recurrence</li> <li>PWD008: Unprotected multithreading recurrence due to out-of-dimension-bounds array access</li> <li>PWD008: Incorrect privatization in OpenMP parallel region</li> <li>PWD011: Incorrect sharing in OpenMP parallel region</li> <li>PWD011: Missing OpenMP last private clause</li> <li>RMK003: Potential temporary variable for the loop which might be privatizable, thus enabling the loop parallelization</li> </ul> | <ul> <li>PWR009: Use OpenMP teams to offload work to GPU</li> <li>PWR013: Avoid copying unused variables to the GPU</li> <li>PWR015: Avoid copying unuecessary array elements to or from the GPU</li> <li>PWR024: Loop can be rewritten in OpenMP connoical form</li> <li>PWR025: Consider annotating pure function with OpenMP 'declare simd'</li> <li>PWR026: Annotate function for OpenMP offload</li> <li>PWR027: Annotate function for OpenACC offload</li> <li>PWD003: Missing array range in data copy to the GPU</li> <li>PWD005: Array range copied to or from the GPU does not cover the used range</li> <li>PWD006: Missing deep copy of non-contiguous data to the GPU</li> </ul> |

### Performance Optimization Platform

```
examples/matmul$ pwreport src/main.c:15 --level 2 -- -I src/include
Compiler flags: -I src/include
ACTIONS REPORT
  FUNCTION BEGIN at src/main.c:matmul:6:1
   6: void matmul(size_t m, size_t n, size_t p, double **A, double **B, double **C) {
    LOOP BEGIN at src/main.c:matmul:15:5
     15: for (size_t i = 0; i < m; i++) {
      [PWR010] src/main.c:15:5 'B' multi-dimensional array not accessed in row-major order
      [RMK005] src/main.c:18:28 avoid non-consecutive array access for variable 'A' to improve performance
      [RMK005] src/main.c:18:38 avoid non-consecutive array access for variable 'B' to improve performance
      [RMK005] src/main.c:18:25 avoid non-consecutive array access for variable 'C' to improve performance
      [RMK005] src/main.c:18:25 avoid non-consecutive array access for variable 'C' to improve performance
      [OPP001] src/main.c:15:5 is a multi-threading opportunity
      [OPP003] src/main.c:15:5 is a offload opportunity
    LOOP END
  FUNCTION END
  FUNCTION BEGIN at src/main.c:main:24:1
   24: int main(int argc, char *argv[]) {
  FUNCTION END
```

**Opportunities (OPP)** Sequential, vectorization, multi-threading and GPU offloading

Recommendations (PWR) Boost performance and ensure best practices

**Defects (PWD)** Find and fix bugs in parallel code and correctness verification

Remarks (RMK) Proficient usage of tools



Scan source code without executing that code



**Report** human-readable actionable recommendations on where and how to fix performance issues



**Compliance** with performance optimization best practices (memory usage, vectorization, multi-threading, offload)



**Optimize** performance for **microprocessors** (x86, Arm, Power) and **accelerators** (GPU)



Automated fixes to actually implement code changes



Customization and extension of built-in rule set



Full workflow support: CI/CD, repository, IDE and issue trackers

#### **First, produce the Codee Performance Optimization Report**

| <pre>\$ pwreportevaluation canny.cinclude-tags all</pre>   |  |  |  |  |  |  |
|--|--|--|--|--|--|--|
| Target Lines of code Analyzed lines Analysis time # actions Effort Cost Profiling  |  |  |  |  |  |  |
| canny.c 656 252 623 ms 114 579 h 18947€ n/a  |  |  |  |  |  |  |
| ACTIONS PER OPTIMIZATION TYPE<br>Target Serial scalar Serial control Serial memory Vectorization Multithreading Offloading   |  |  |  |  |  |  |
| canny.c 17 49 8 15 22 3  |  |  |  |  |  |  |
| Target : analyzed directory or source code file<br>Lines of code : total lines of code found in the target (computed the same way as the sloccount tool)<br>Analyzed lines : relevant lines of code successfully analyzed<br>Analysis time : time required to analyze the target<br># actions : total actionable items (opportunities, recommendations, defects and remarks) detected<br>Effort : estimated number of hours it would take to carry out all actions (serial scalar, serial control, serial memory, vectorization,<br>multithreading and offloading with 1, 2, 4, 8, 12 and 16 hours respectively)<br>Cost : estimated cost in euros to carry out all the actions, paying the average salary of 56,286€/year for a professional C/C++ developer<br>working 1720 hours per year<br>Profiling : estimation of overall execution time required by this target |  |  |  |  |  |  |
| SUGGESTIONS<br>You can specify multiple inputs which will be displayed as multiple rows (ie. targets) in the table, eg:<br>pwreportevaluation some/other/dir canny.cinclude-tags all   |  |  |  |  |  |  |
| Useactions to find out details about the detected actions:<br>pwreportactions canny.cinclude-tags all  |  |  |  |  |  |  |
| You can focus on a specific optimization type by filtering by its tag (serial-scalar, serial-control, serial-memory, vectorization,<br>multithreading, offloading), eg.:<br>pwreportactionsinclude-tags serial-scalar canny.c  |  |  |  |  |  |  |
| 1 file successfully analyzed and θ failures in 123 ms  |  |  |  |  |  |  |

#### Second, produce the Codee Actions Report

#### 

\$ pwreport --actions --level 2 canny.c:gaussian\_smooth --include-tags all

#### ACTIONS REPORT

[RMK010] canny.c:496:10 the vectorization cost model states the loop is not a SIMD opportunity due to strided memory accesses in the loop body

```
More information on: https://www.appentra.com/knowledge/rmk010 ...
```

```
[OPP001] canny.c:492:4 is a multi-threading opportunity
Compute patterns:
```

- 'forall' over the variable 'smoothedim'

```
SUGGESTION: use pwloops to get more details or pwdirectives to generate directives to parallelize it:
    pwloops canny.c:gaussian_smooth:492:4
    pwdirectives --omp multi canny.c:gaussian_smooth:492:4 --in-place
```

```
More information on: https://www.appentra.com/knowledge/opportunities ..
```

```
$ pwdirectives --omp multi canny.c:gaussian_smooth:492:4 --out-file canny_optimized.c
Successfully parallelized loop at 'canny.c:gaussian_smooth:492:4' [using multi-threading]:
```

```
$ cc canny.c -fopenmp -03 -lm -o canny
$ ./canny testvecs/input/15360_8640.pgm 0.5 0.7 0.9
Total time: 14.594
```

```
$ cc canny_optimized.c -fopenmp -03 -lm -o canny
$ ./canny testvecs/input/15360_8640.pgm 0.5 0.7 0.9
Total time: 8.488
```

### And Measure the Performance Improvement enabled by Codee

NPB CG Performance

- The primary goal is to show performance gain on the target application code
- Target hardware platform equipped with:
  - x86/Arm processor
  - Clang/GCC compiler
  - Linux OS



The loop cg.c:conj\_grad:458:5 runs 3 times faster that the original version on an AMD Ryzen 7 4800H laptop with 8 cores and 16 hardware threads, 16 GB of memory, Linux Ubuntu 20.04 operating system and CLANG 10 compiler.

Blog post "A touch of parallelism: example of NPB CG Benchmark": <u>https://www.codee.com/touch-of-parallelism-example-of-npb-cg-benchmark/</u>

### **Improvement in Performance enabled by Codee**

| Codee's<br>programming techniques<br>specialized in performance | Micro<br>processors | Micro<br>controllers | Other<br>devices | Performance gains<br>following Codee's<br>best practices   |  |
|---|---------------------|----------------------|------------------|--|--|
| Sequential Scalar optimization                                  | x                   | x                    | x                | HACCmk runs <b>70% faster</b> (from 37s down to 11s)   |  |
| Sequential Control flow optimization                            | x                   | x                    | x                | HotSpot3D runs <b>26% faster</b> (from 2.7s down to 2s)  |  |
| Sequential Memory optimizations                                 | x                   | x                    | x                | Canny runs <b>63% faster</b> (from 9s down to 4.5s)  |  |
| Vectorization SIMD  | x                   |                      | x                | Hotspot runs <b>17% faster</b> (from 4s down to 3.3s)  |  |
| Multithreading multicore CPU                                    | x                   |                      | x                | HACCmk runs <b>92% faster</b> (from 92s down to 6.5s)<br>NPB CG runs <b>63% faster</b> (from 141ms down to 52ms) |  |
| Offloading GPU  |                     |                      | x                | MATMUL runs <b>96% faster</b> (from 57s down to 2.4s)  |  |

### Typical Use Cases for C/C++ Developers: Profile guided!



### Typical Use Cases for C/C++ Developers: Profile guided!





# codee

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