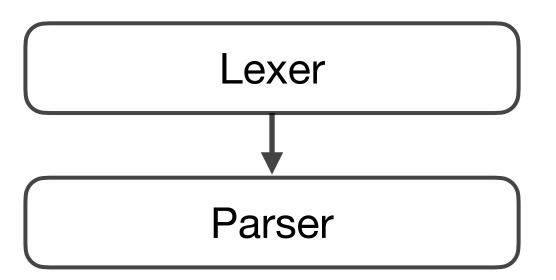
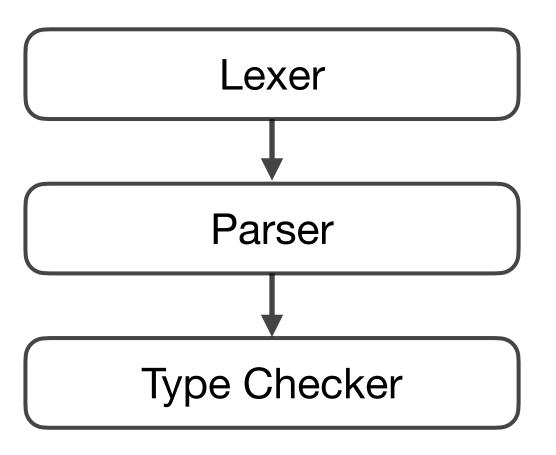
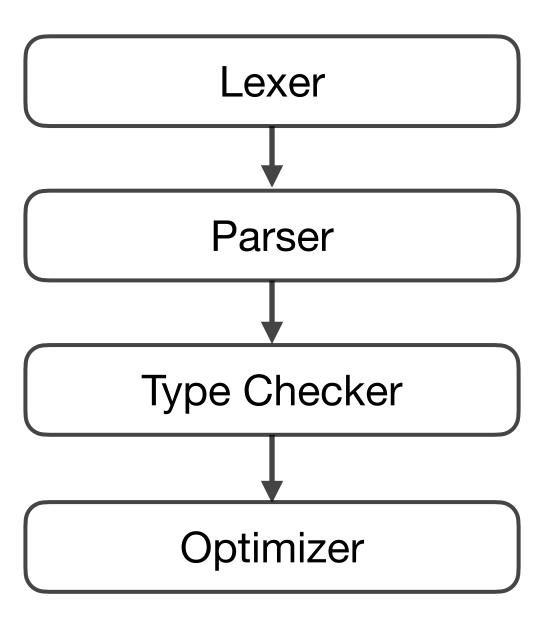
Lecture 10 — Fast Compilation

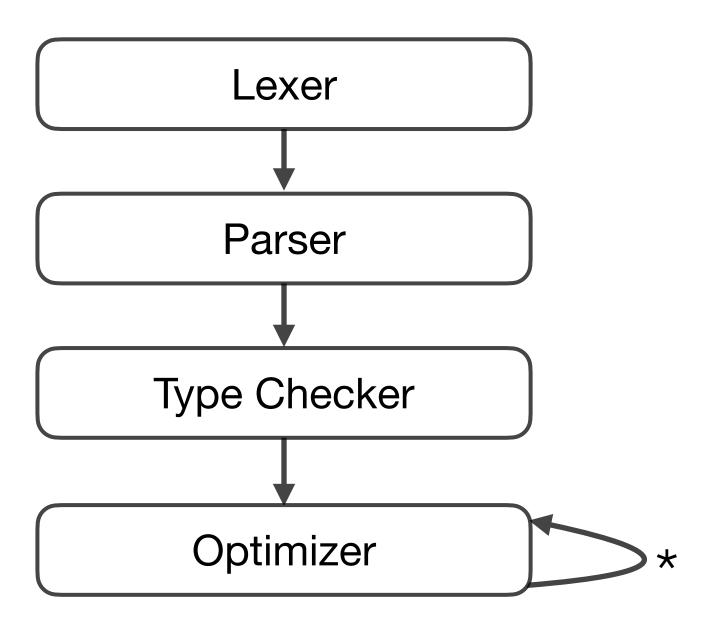
Stanford CS343D (Winter 2025)
Fred Kjolstad

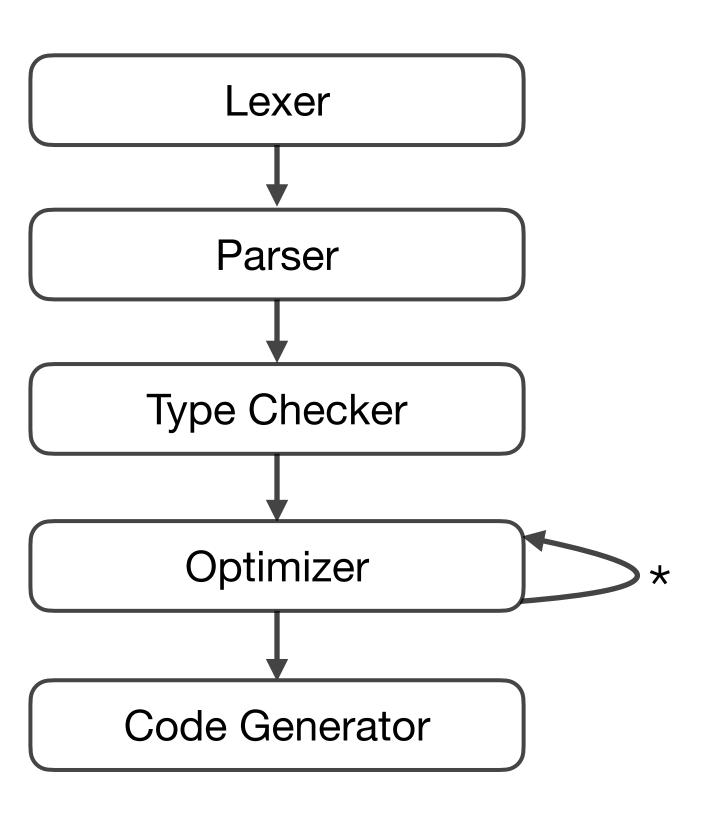
Lexer

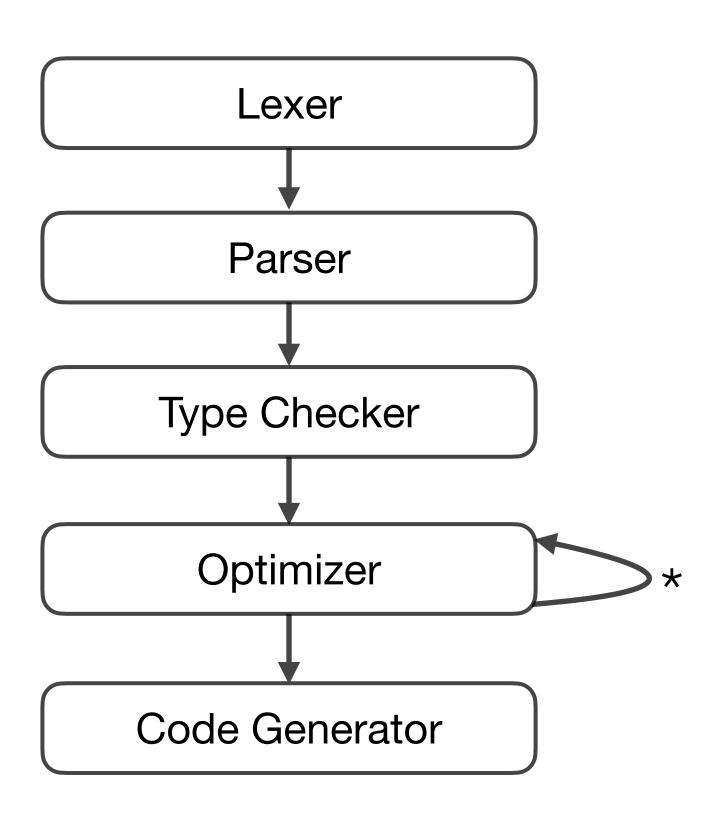




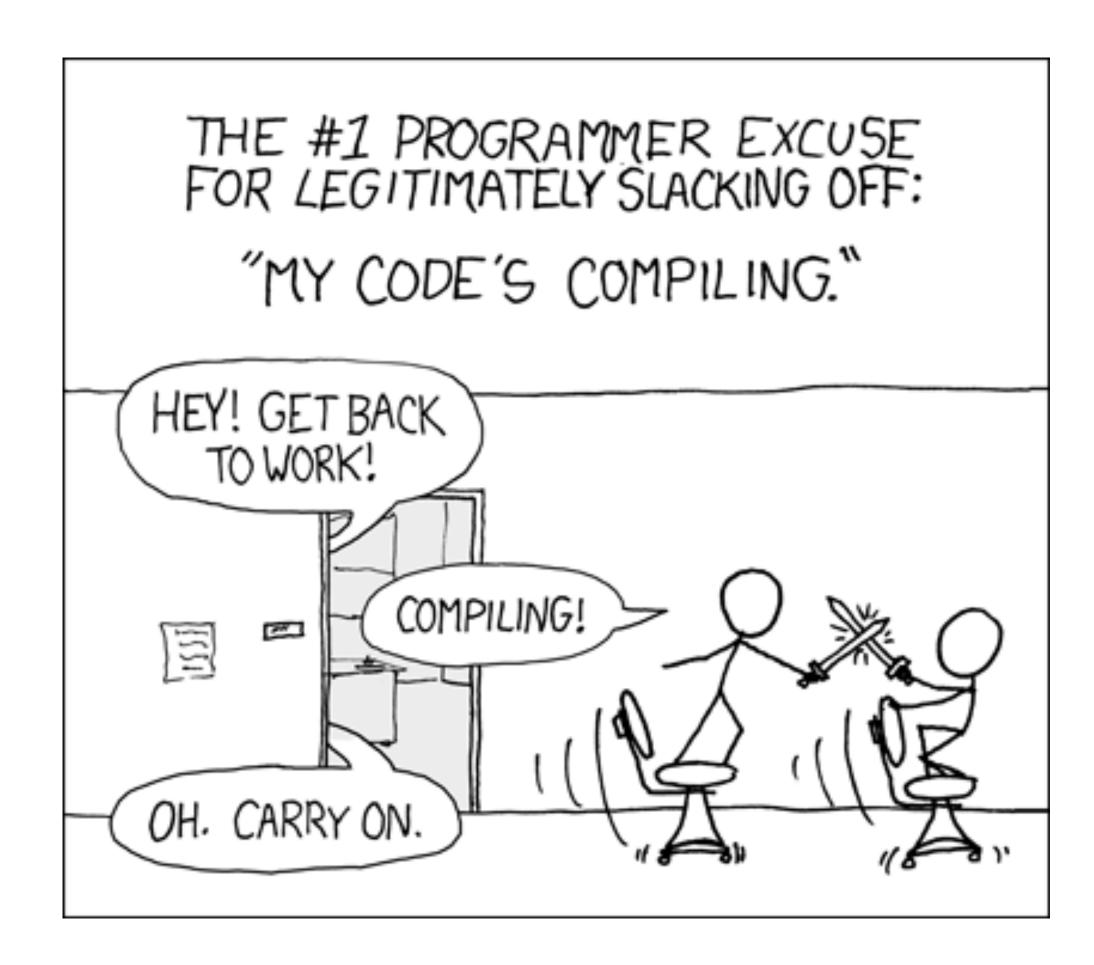




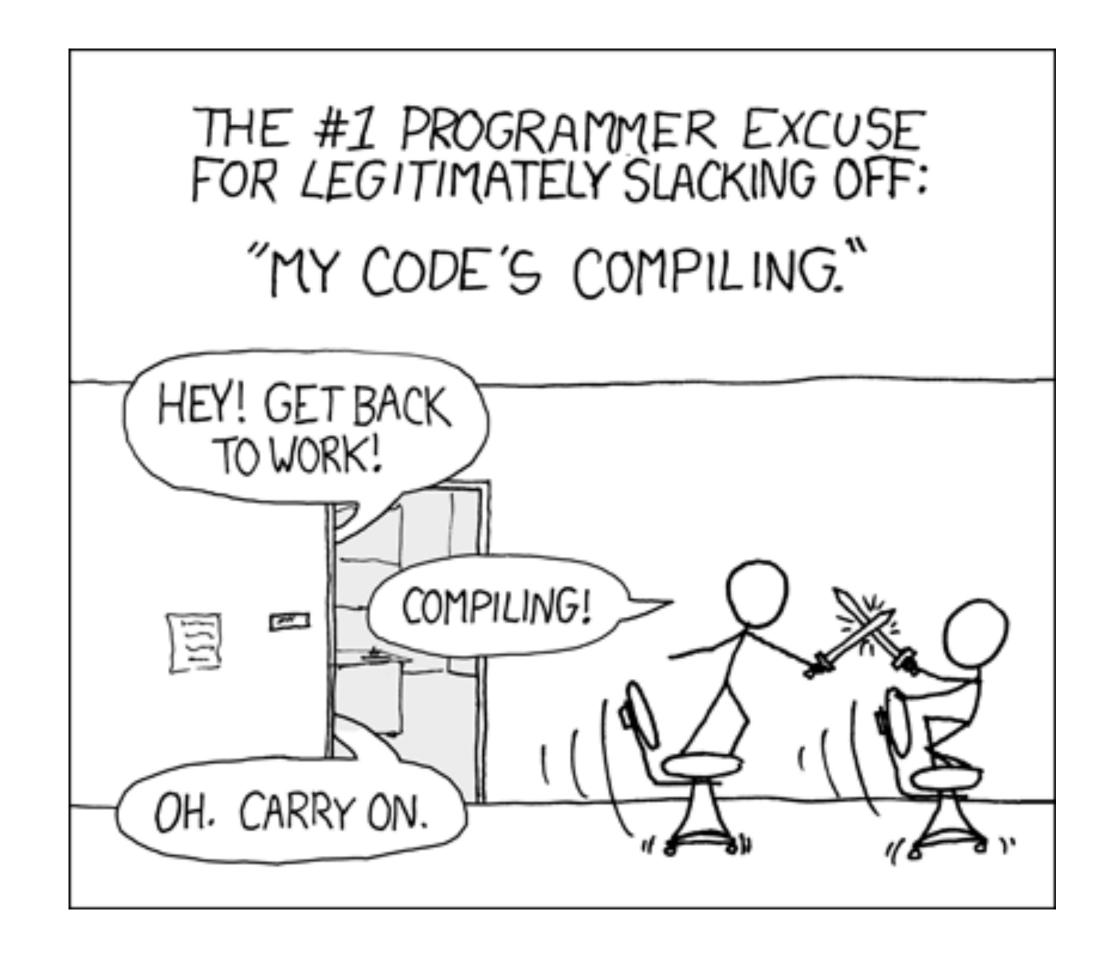




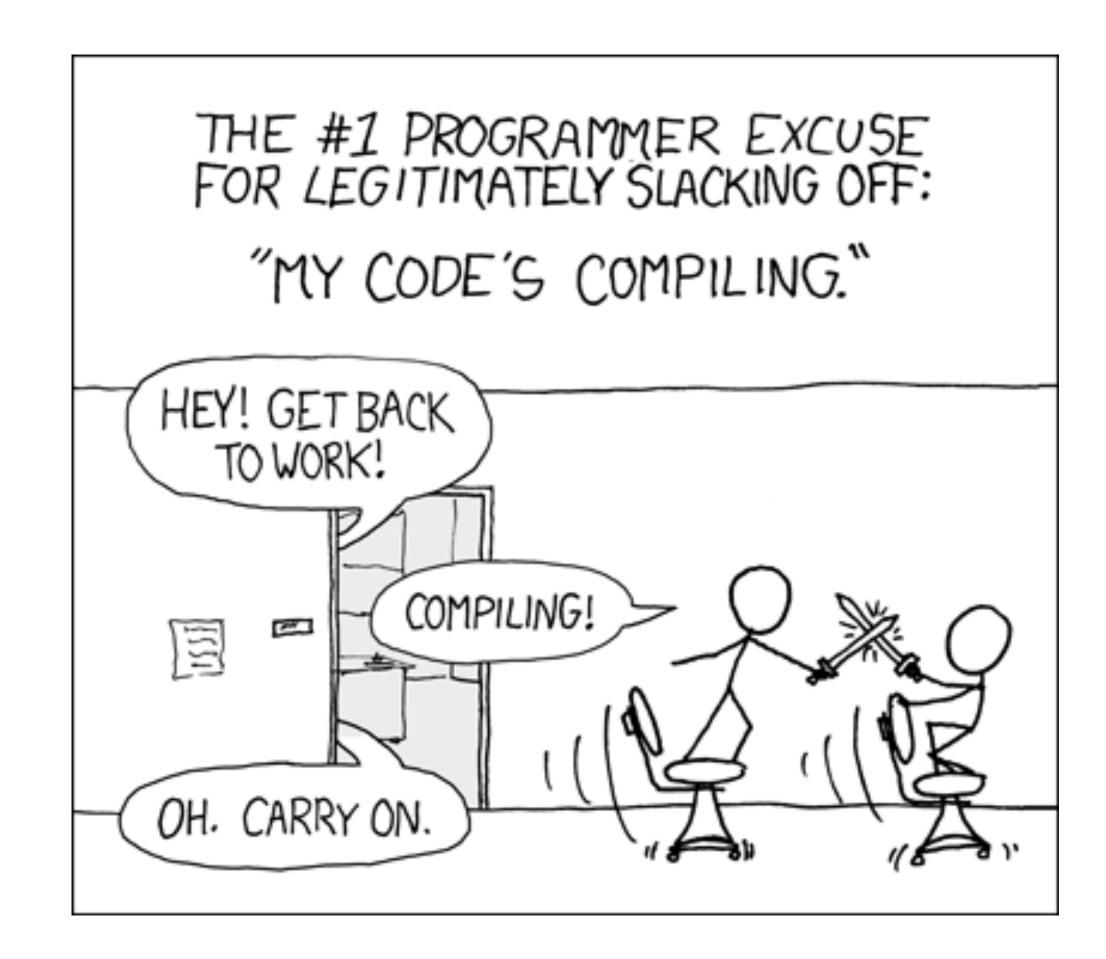
There is a lot of work to compiling optimized code



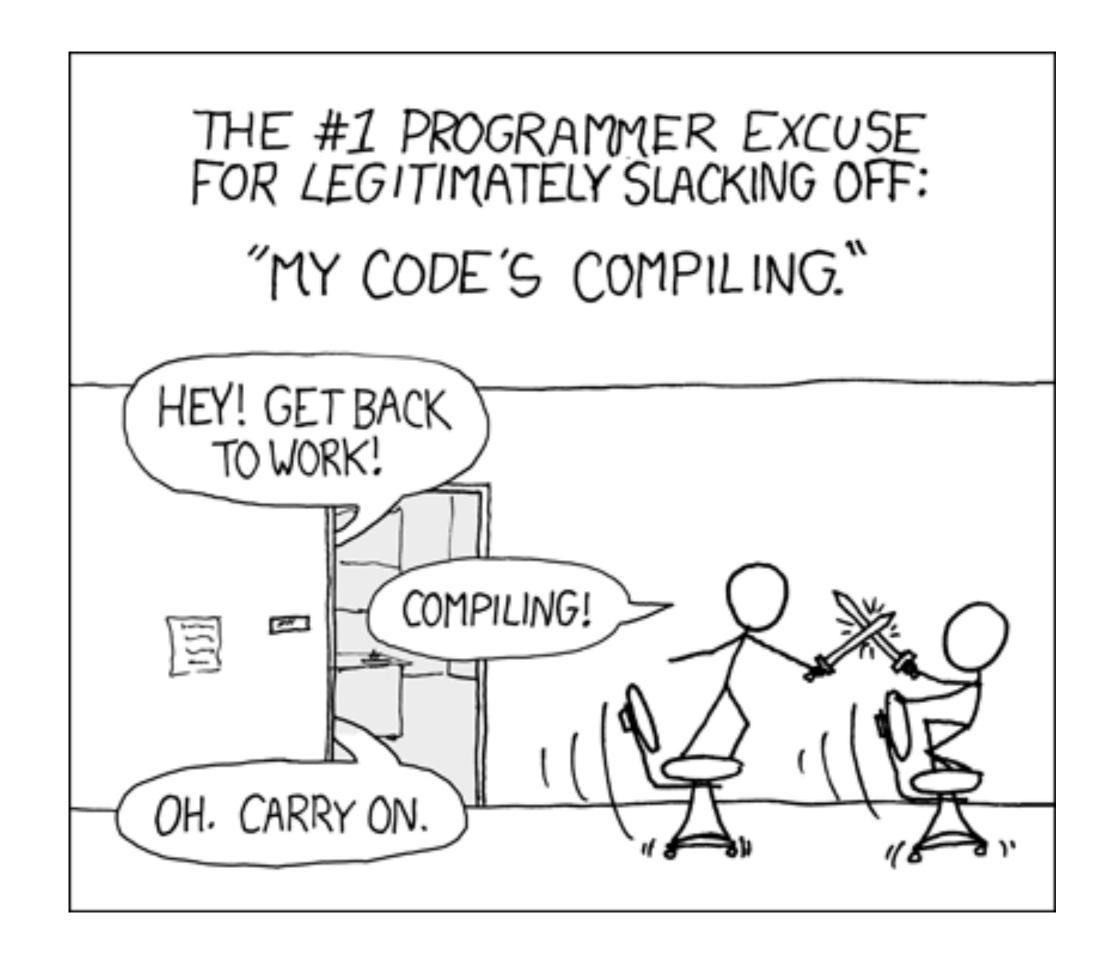
LLVM -O0 vs -O2 (10x difference)



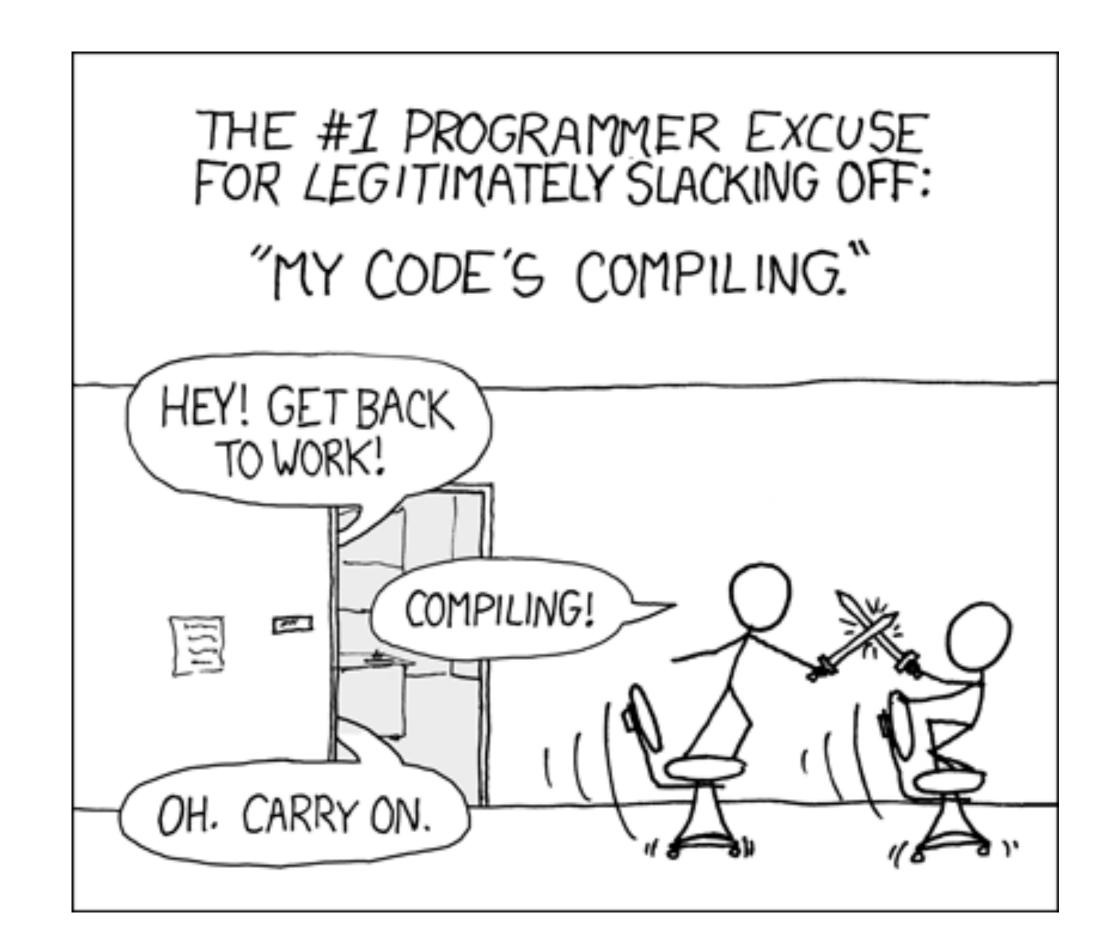
- LLVM -O0 vs -O2 (10x difference)
- Scala (large type checking cost)



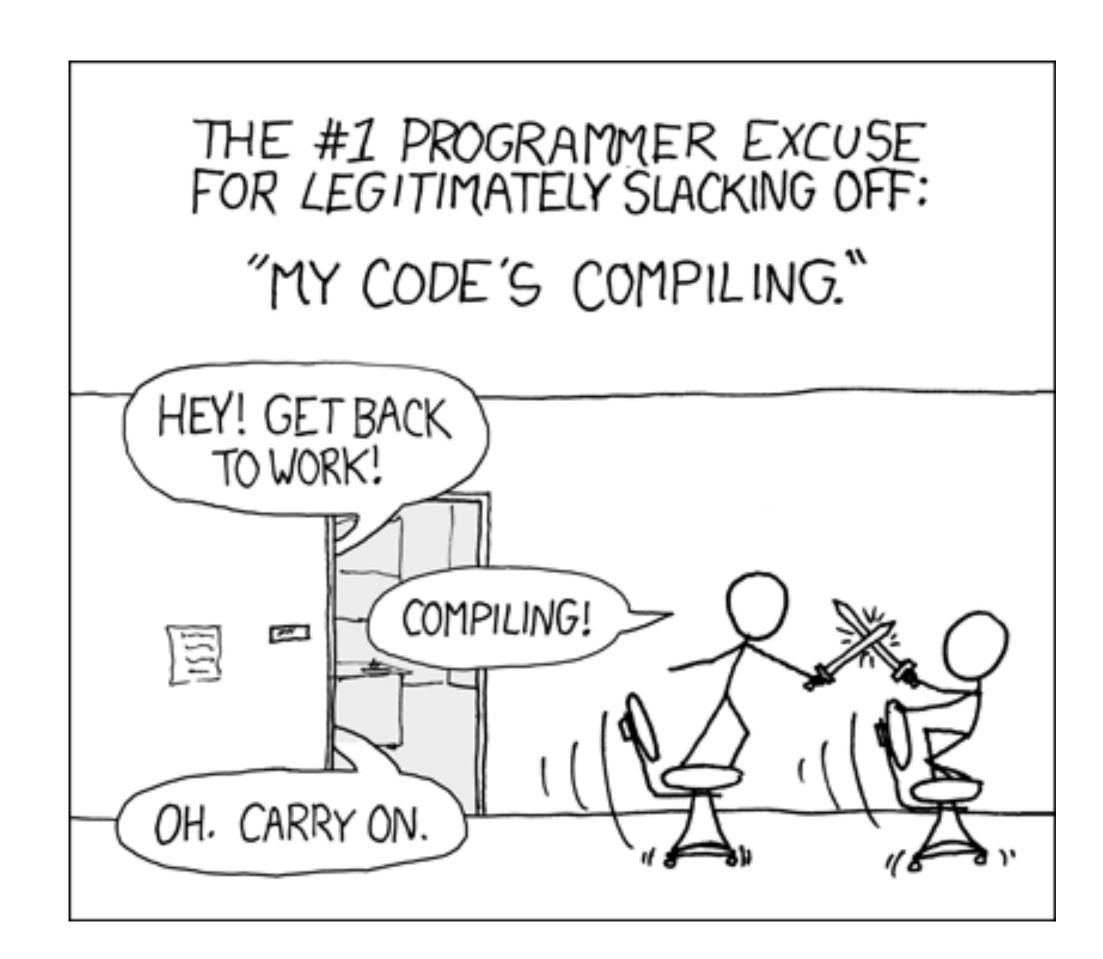
- LLVM -O0 vs -O2 (10x difference)
- Scala (large type checking cost)
- WebAssembly (51s for AutoCAD)



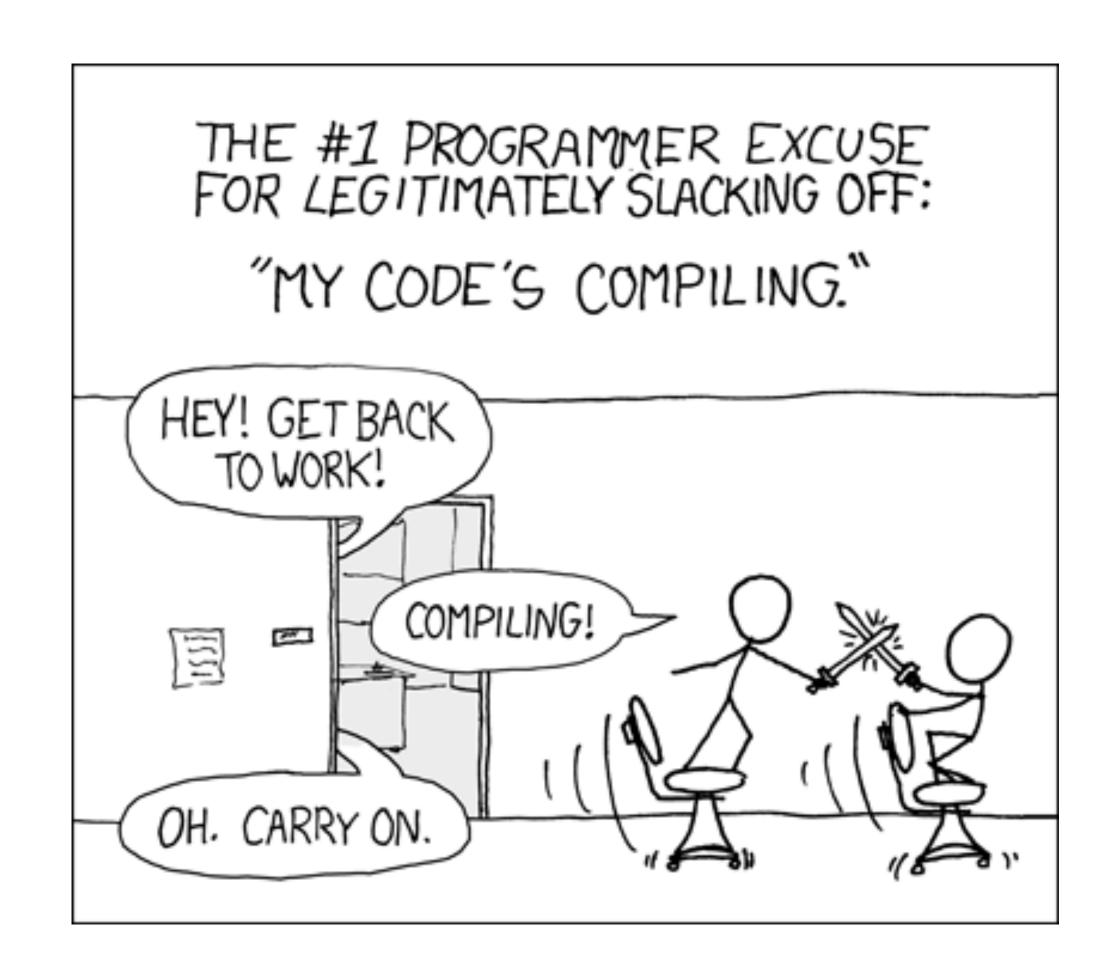
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- Databases (4.5s for TPC Q19 query)



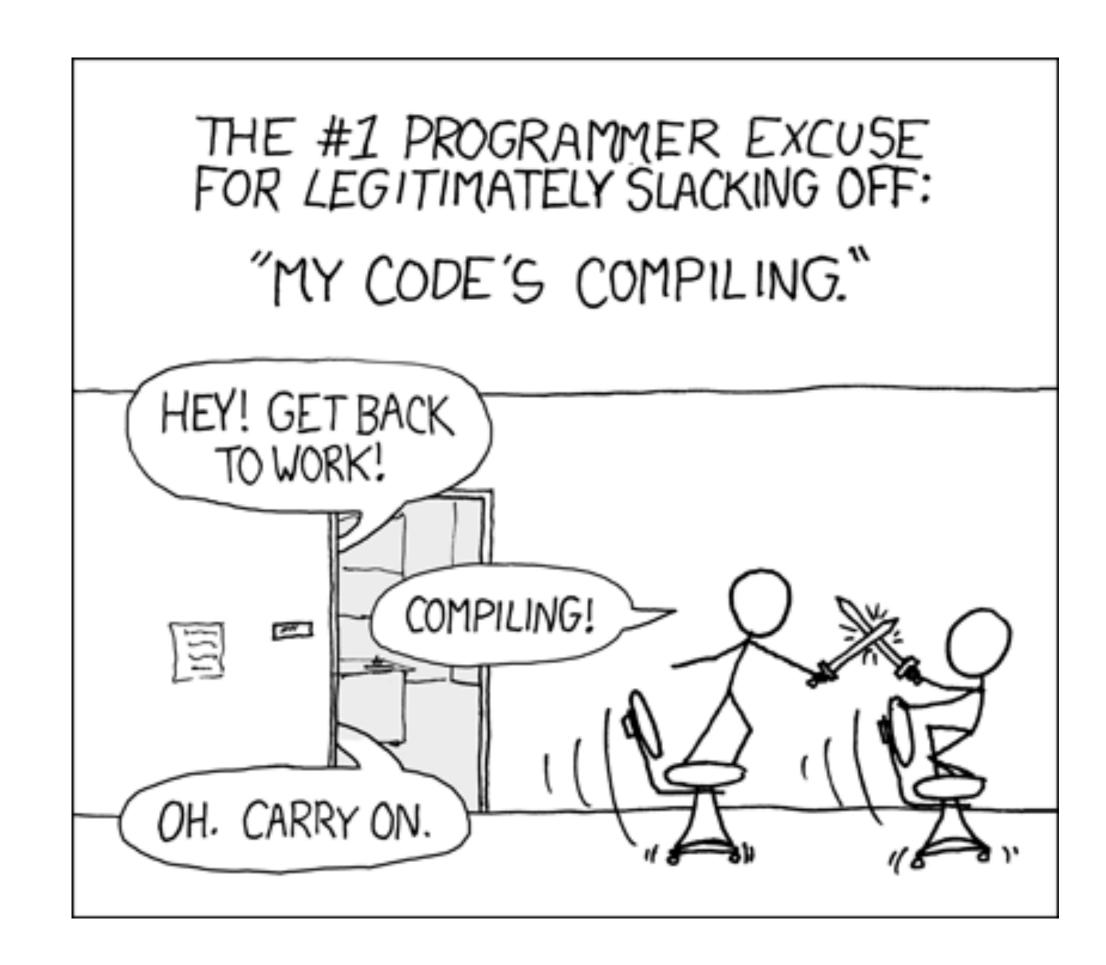
- LLVM -O0 vs -O2 (10x difference)
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- LLVM -O0 vs -O2 (10x difference)
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- JIT compilers (compilation at runtime)
- JavaScript (teams of engineers)

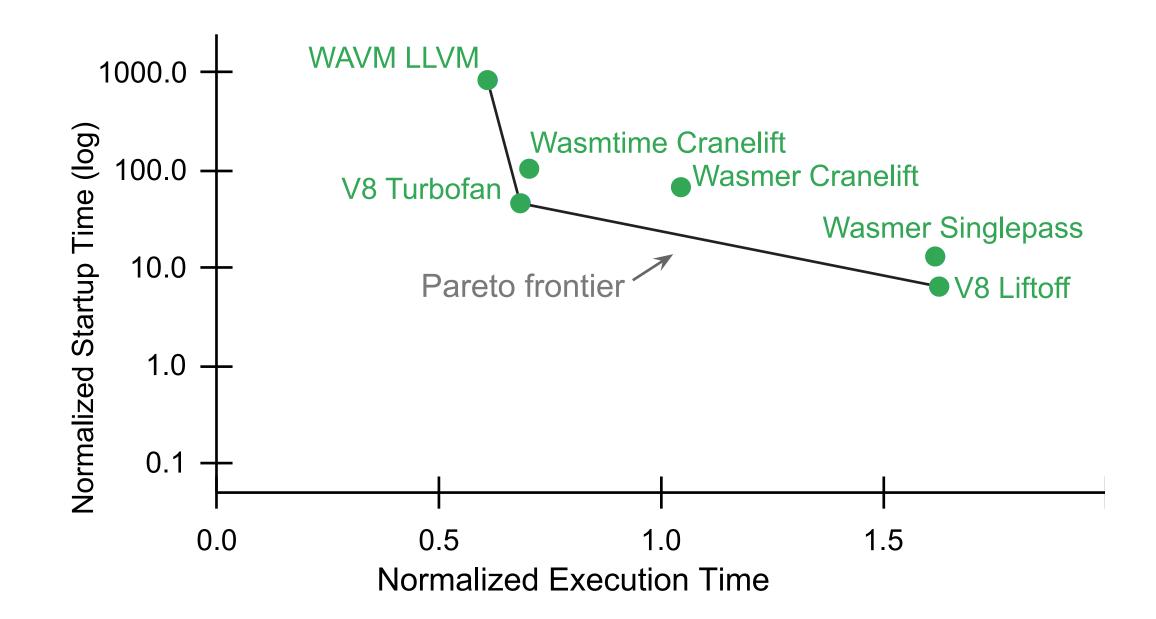


How can we speed up compilation? — Let us brainstorm

How can we speed up compilation? — Let us brainstorm

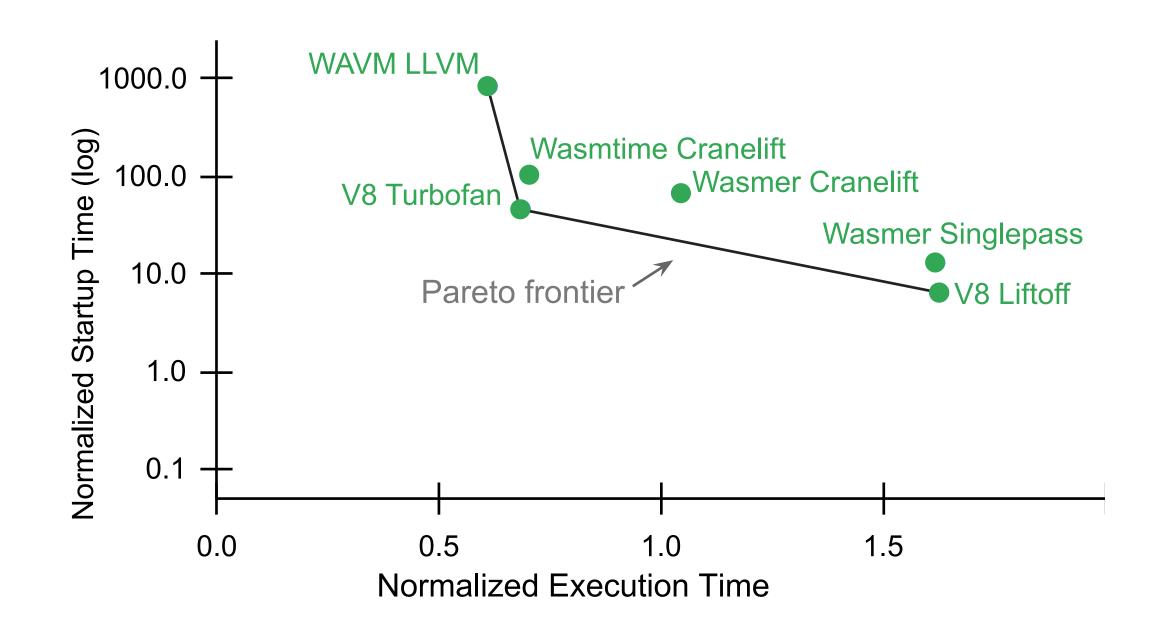
- Multithreading
- Turn off optimization
- Interpretation instead of compilation
- Use bytecode for partial pre-compilation
- Change language: e.g., simplify type system

Tradeoff between compilation time and code performance

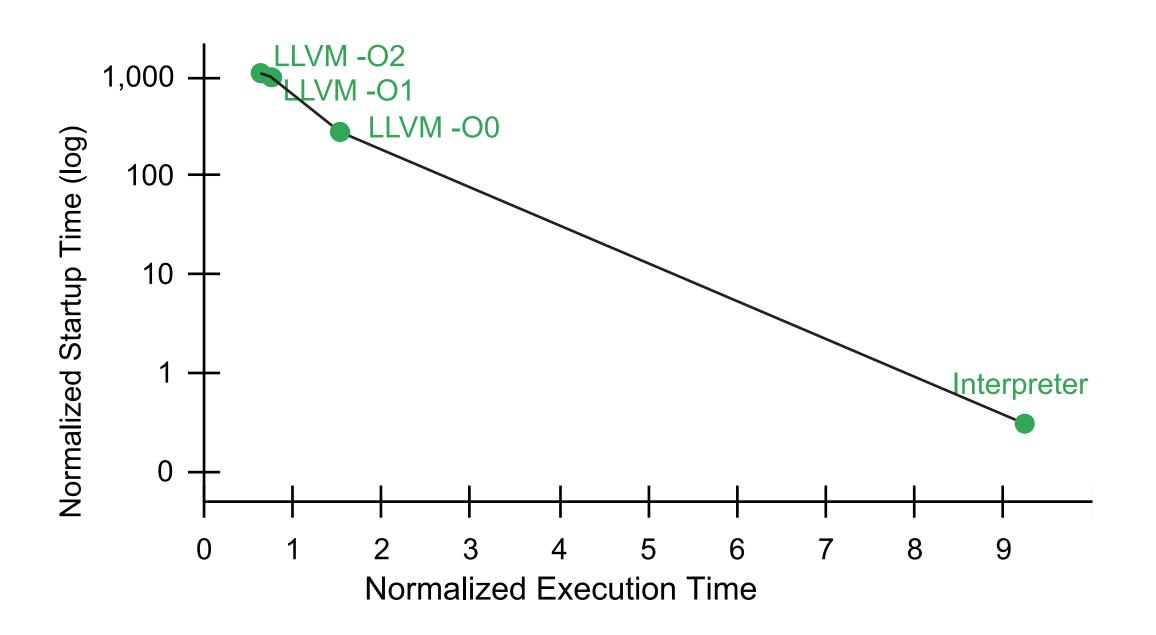


WebAssembly (PolyBench benchmarks)

Tradeoff between compilation time and code performance



WebAssembly (PolyBench benchmarks)



Database Query (TPC-H Q6)

Tier 1: Fast startup

- Interpreter
- LLVM -O0
- Baseline single-pass compilers

Tier 1: Fast startup

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Tier 2: Fast execution

- Java HotSpot JIT Compiler
- LLVM -O2
- Google V8 TurboFan

Tier 1: Fast startup

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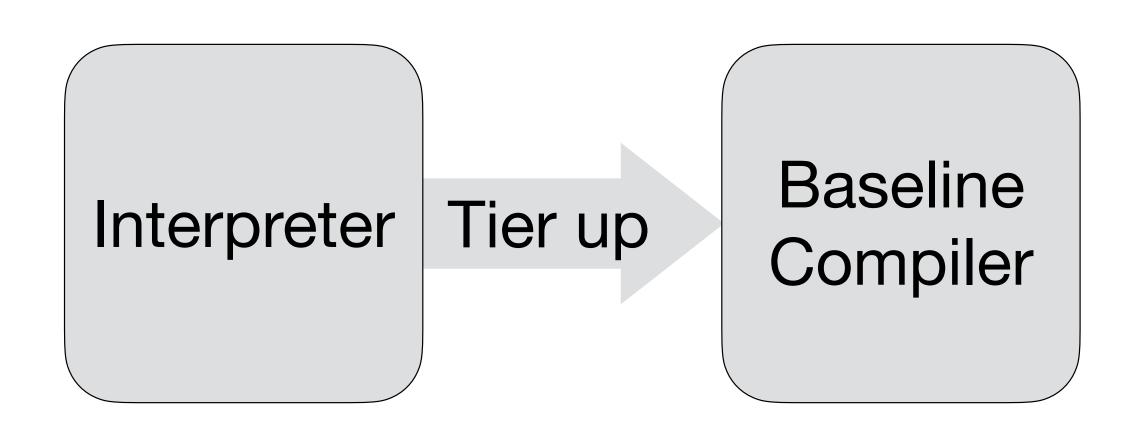
Used in many dynamic language VMs, compilers, and databases

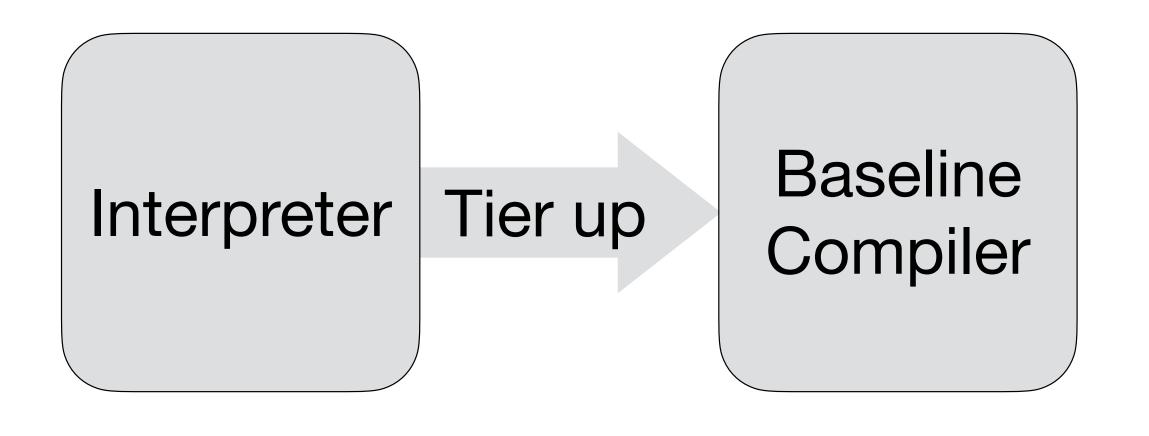
Examples: Java, JavaScript, Lua, WebAssembly, Databases

Interpreter

Interpreter

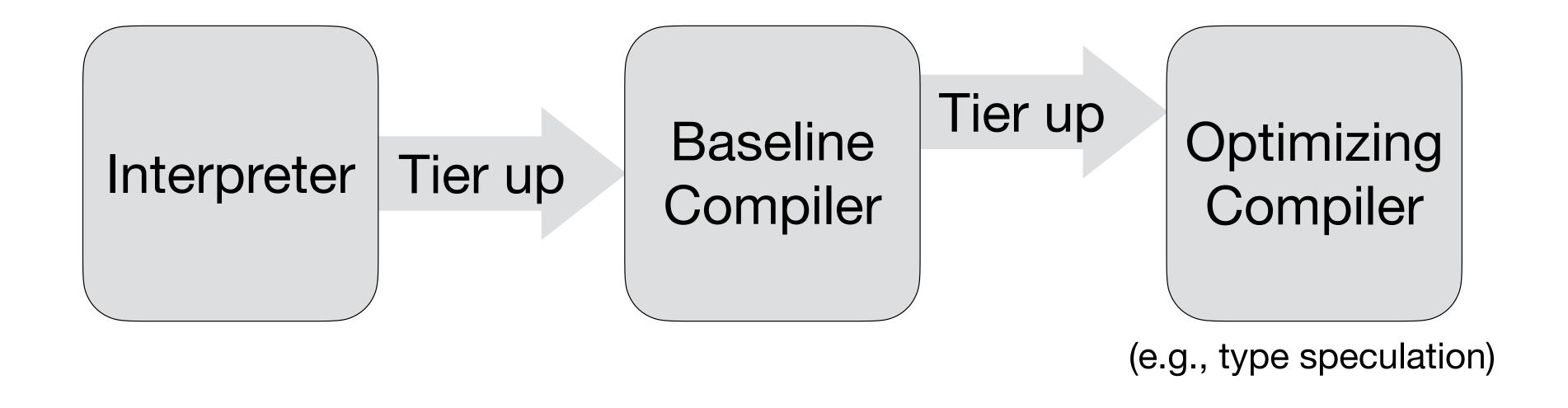
Baseline Compiler

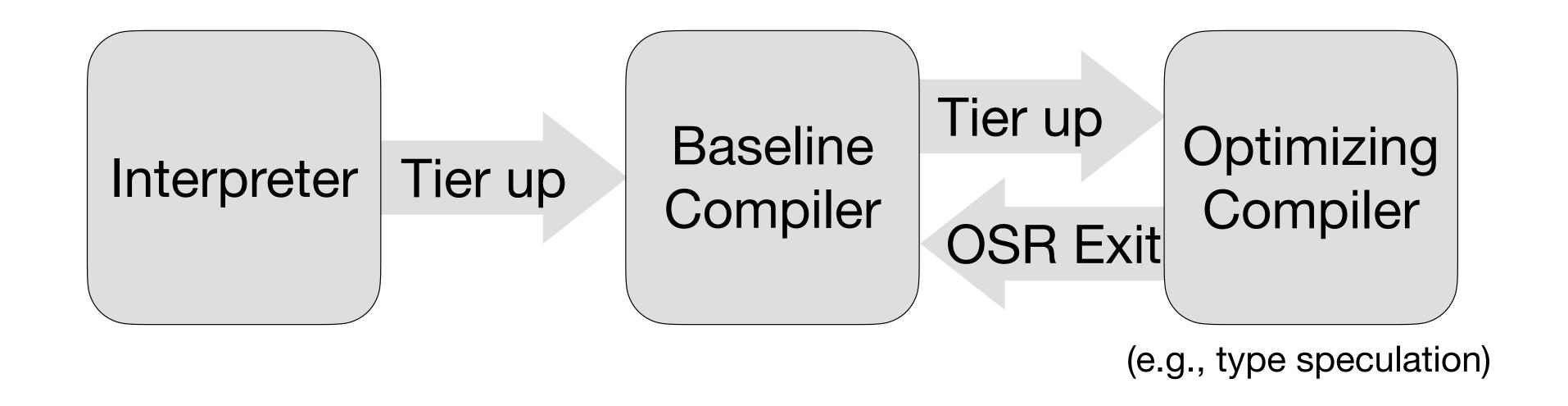


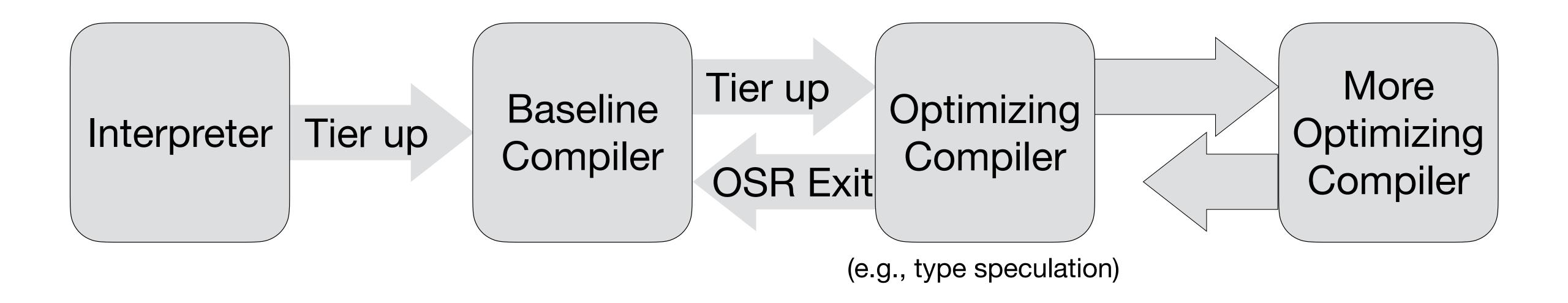


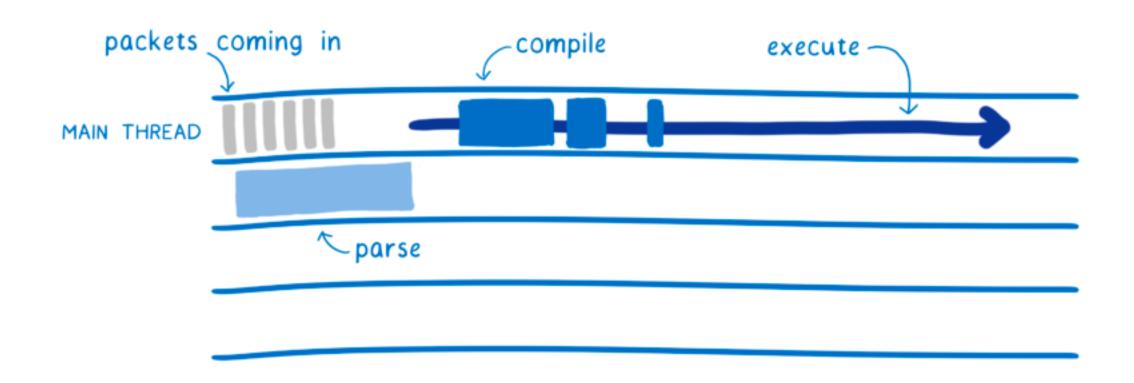
Optimizing Compiler

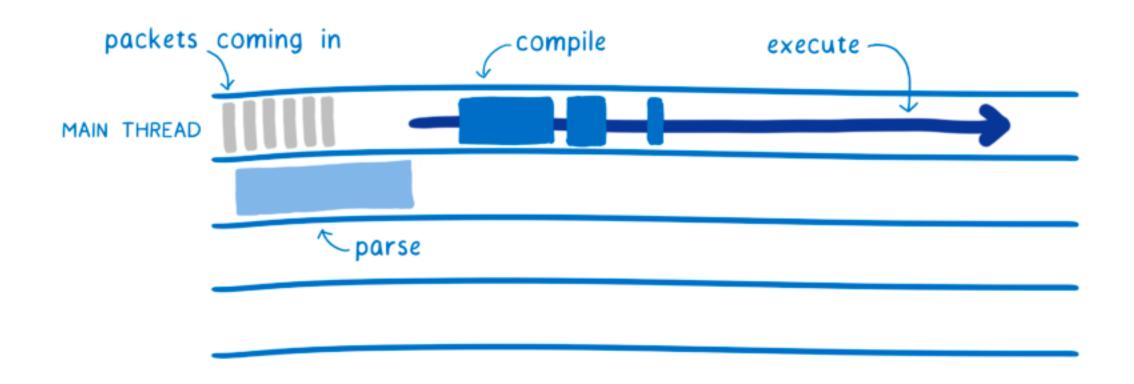
(e.g., type speculation)



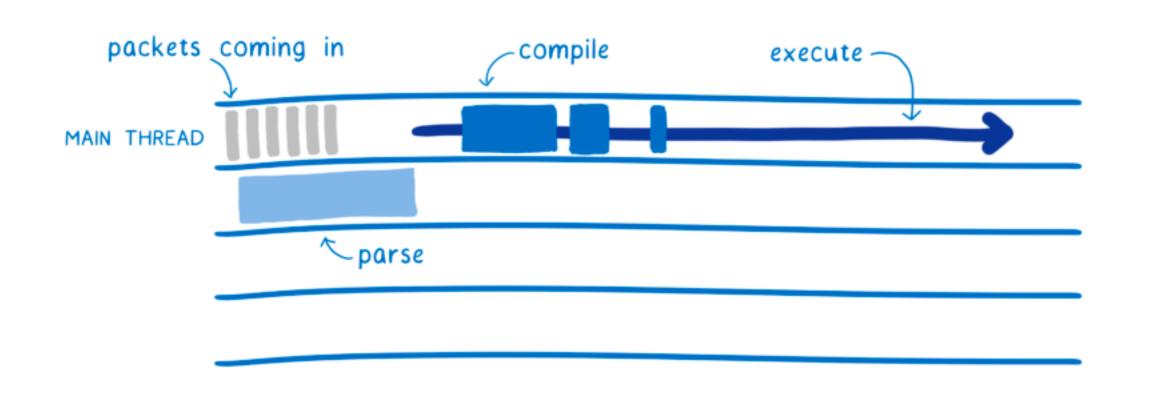


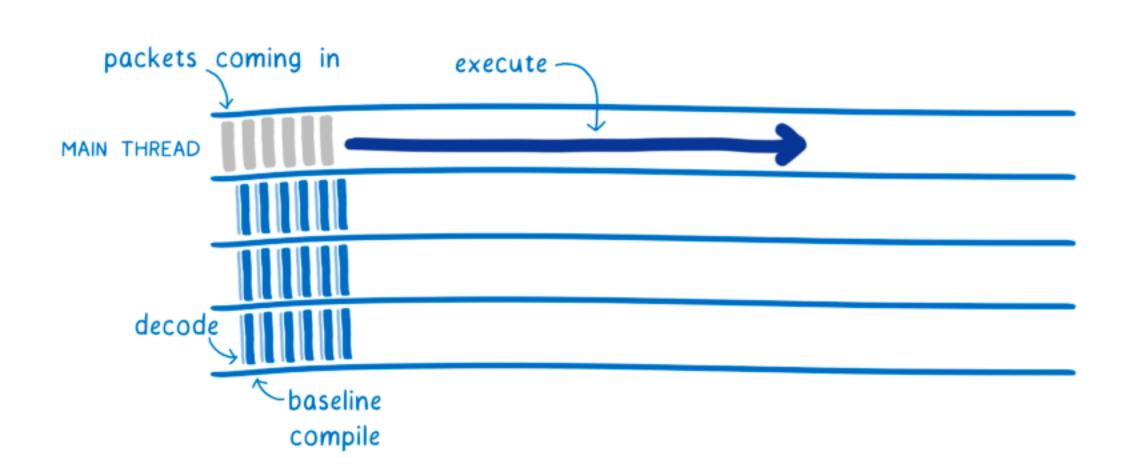






200ms can be perceived by users and cause them to visit a webpage less frequently





200ms can be perceived by users and cause them to visit a webpage less frequently

WebAssembly (sent in binary)

```
(func (param i32) (result i32)
  local.get 0
  i32.eqz
  if (result i32)
      i32.const 1
  else
      local.get 0
      local.get 0
      i32.const -1
      i32.add
      call 0
      i32.mul
  end)
```

Baseline compiler web example

WebAssembly (sent in binary)

Baseline Compilation

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(func (param i32) (result i32)
  local.get 0
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Baseline compiler web example

WebAssembly (sent in binary)

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     i32.add
     call 0
     i32.mul
 end)
```

Baseline compiler rule (Firefox)

```
void BaseCompiler::emitAddI32() {
    RegI32 r, rs;
    pop2xI32(&r, &rs);
    masm.add32(rs, r);
    freeI32(rs);
    pushI32(r);
```

Baseline compiler web example

WebAssembly (sent in binary)

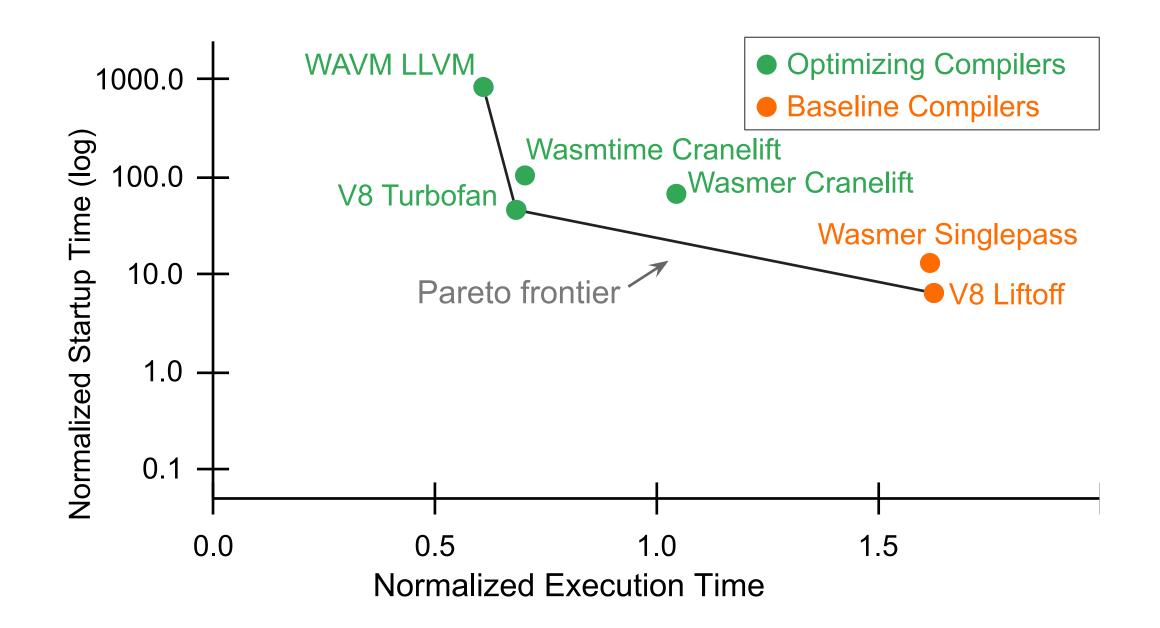
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Baseline compiler rule (Firefox)

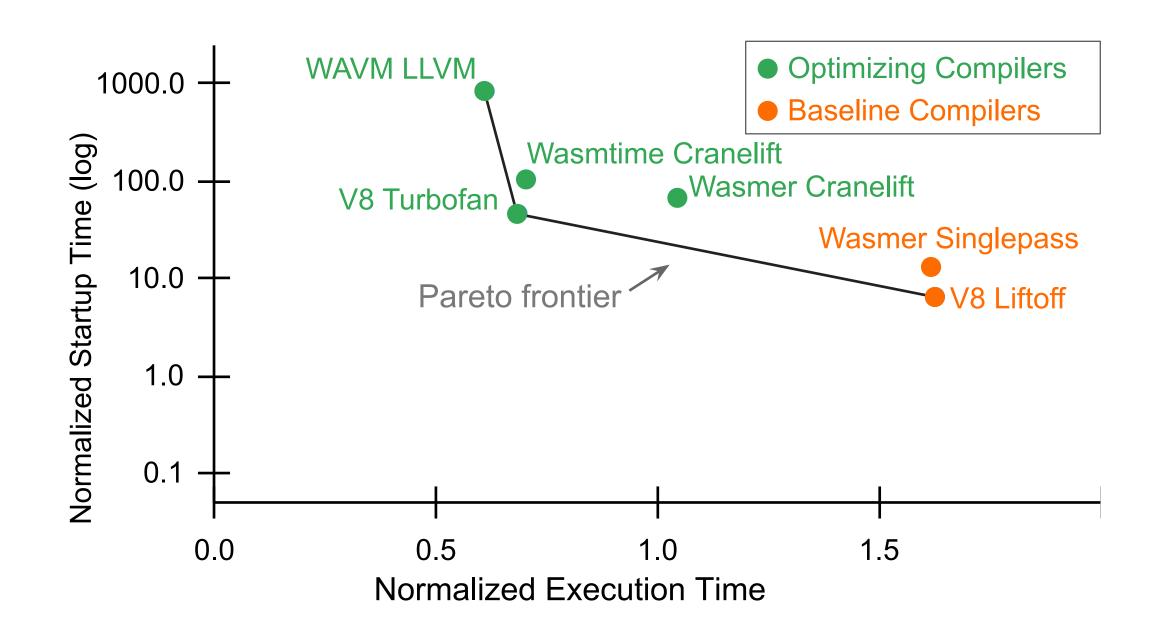
```
void BaseCompiler::emitAddI32() {
   int32_t c;
   if (popConstI32(&c)) {
      RegI32 r = popI32();
      masm.add32(Imm32(c), r);
      pushI32(r);
   } else {
      RegI32 r, rs;
      pop2xI32(&r, &rs);
      masm.add32(rs, r);
      freeI32(rs);
      pushI32(r);
   }
}
```

Copy-and-Patch is a fast baseline compilation algorithm

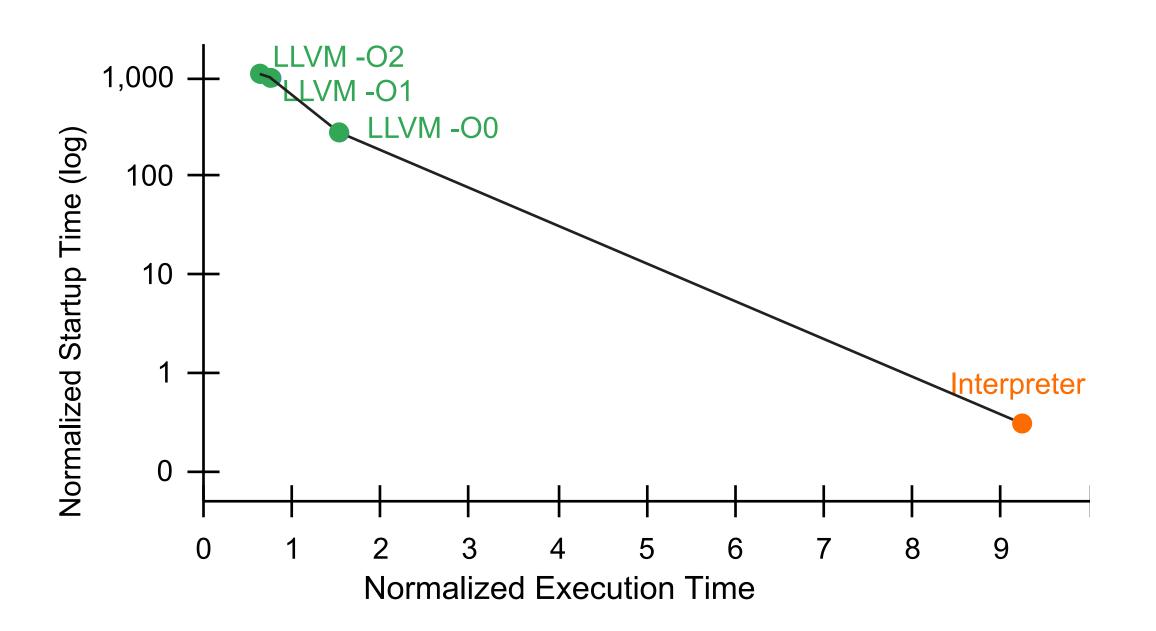


WebAssembly (PolyBench benchmarks)

Copy-and-Patch is a fast baseline compilation algorithm

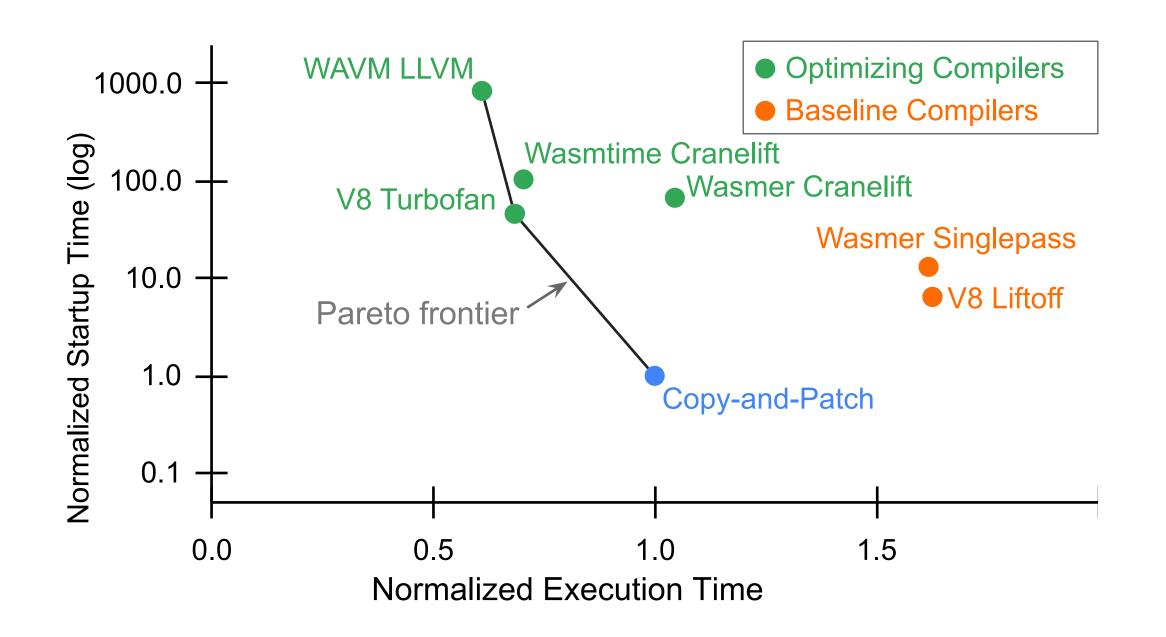


WebAssembly (PolyBench benchmarks)

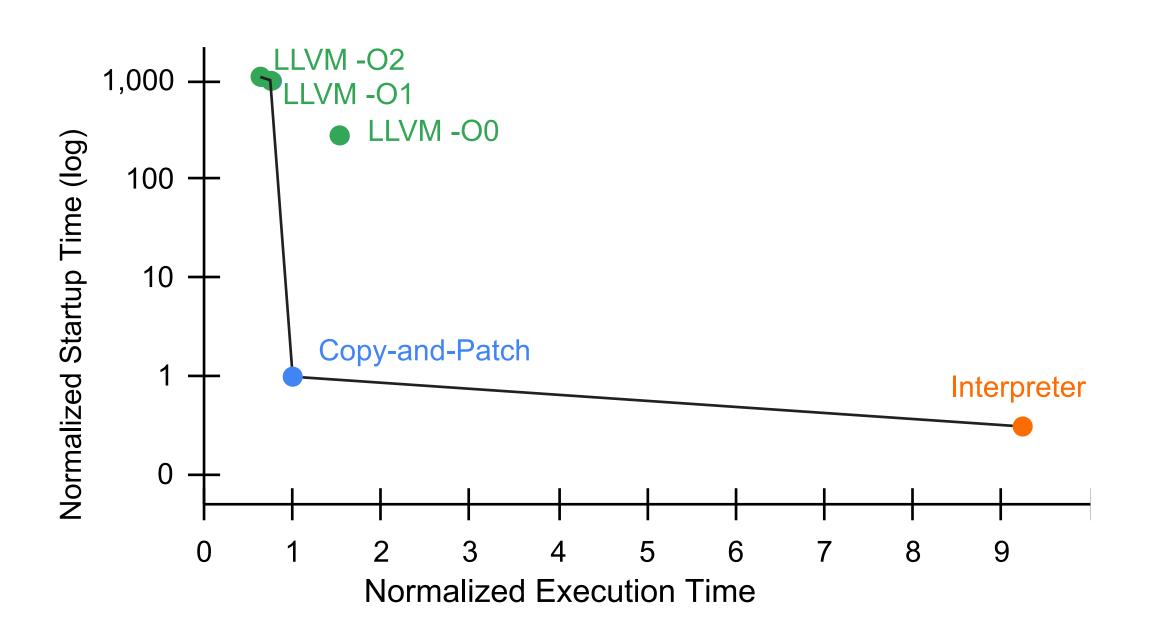


Database Query (TPC-H Q6)

Copy-and-Patch is a fast baseline compilation algorithm



WebAssembly (PolyBench benchmarks)



Database Query (TPC-H Q6)

Two use cases

WebAssembly

Applications Clang with WebAssembly Backend Client Browser WebAssembly Bytecode Tier 1: Copy-and-Patch Tier 2: Optimizing Compiler

Two use cases

WebAssembly

Applications Clang with WebAssembly Backend Client Browser WebAssembly Bytecode Tier 1: Copy-and-Patch Tier 2: Optimizing Compiler

Metaprogramming System

Applications, Query Compilers, and DSL Libraries

Metaprogramming API

Abstract Syntax Tree (AST)

Copy-and-Patch Backend

LLVM Backend

Library of precompiled language constructs

```
add
sub neg
load mul
for if
while
```

Library of precompiled language constructs

```
add
sub
neg
load mul
for if
while
```

(missing stack offsets and jump targets)

Library of precompiled language constructs

```
add
sub neg
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At compile-time

Library of precompiled language constructs

```
add
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At compile-time

For each AST node:

Library of precompiled language constructs

```
add
sub neg
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```

(missing stack offsets and jump targets)

At compile-time

For each AST node:

1. Hash lookup

Library of precompiled language constructs

```
add
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while
```

(missing stack offsets and jump targets)

At compile-time

For each AST node:

- 1. Hash lookup
- 2. Binary code copy

Library of precompiled language constructs

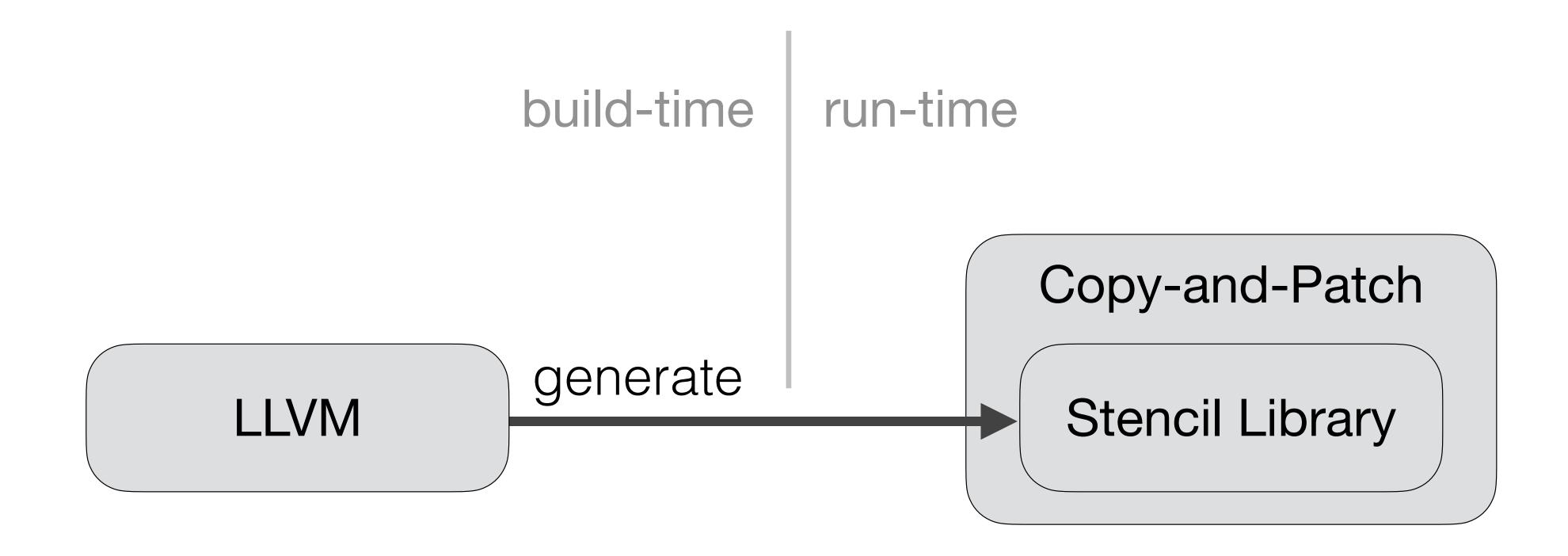
```
add
sub neg
load mul
for if
while
```

(missing stack offsets and jump targets)

At compile-time

For each AST node:

- 1. Hash lookup
- 2. Binary code copy
- 3. Patch in stack offsets and jump targets



• Vilfredo Pareto: "80% of the consequences come from 20% of causes"

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 - 1. Instruction selection

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- Vilfredo Pareto: "80% of the consequences come from 20% of causes"
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 - 1. Instruction selection
 - 2. Register Allocation

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Precompile specialized stencil variants for constants and super-nodes

Library of precompiled language constructs

```
add
sub neg
load mul
for if
while
```

Precompile specialized stencil variants for constants and super-nodes

Library of precompiled language constructs

Precompile specialized stencil variants for constants and super-nodes

Library of precompiled language constructs

At compile-time

Precompile specialized stencil variants for constants and super-nodes

Library of precompiled language constructs

while

At compile-time

For each AST node:

Precompile specialized stencil variants for constants and super-nodes

Library of precompiled language constructs

At compile-time

For each AST node:

1. Supernode Tree search

Precompile specialized stencil variants for constants and super-nodes

Library of precompiled language constructs

At compile-time

For each AST node:

- 1. Supernode Tree search
- 2. Hash lookup

Precompile specialized stencil variants for constants and super-nodes

Library of precompiled language constructs

At compile-time

For each AST node:

- 1. Supernode Tree search
- 2. Hash lookup
- 3. Binary code copy

- - -

Precompile specialized stencil variants for constants and super-nodes

Library of precompiled language constructs

At compile-time

For each AST node:

- 1. Supernode Tree search
- 2. Hash lookup
- 3. Binary code copy
- 4. Patch in stack offsets, jump targets, and constants

- - -

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

At compile-time

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

```
add(const, const)
add(stack, const) add(r1, r2)
```

```
sub(stack,stack) load_offset
for if if_leq
```

while

At compile-time

For each AST node:

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

At compile-time

For each AST node:

1. Supernode Tree search

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

At compile-time

For each AST node:

- 1. Supernode Tree search
- 2. Expression register allocation

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

At compile-time

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Idea 3: Register Allocation

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

At compile-time

For each AST node:

- 1. Supernode Tree search
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- 4. Binary code copy

. . .

Idea 3: Register Allocation

Precompile specialized stencil variants that use different registers

Library of precompiled language constructs

. . .

At compile-time

For each AST node:

- 1. Supernode Tree search
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- 4. Binary code copy
- 5. Patch in stack offsets, jump targets, and constants

Compile a large stencil variant library for use during compilation

Created at compiler build time, used to compile at runtime

WebAssembly

- 1666 stencils
- 30 kilobytes
- <1 minute to compile</p>

High-Level Imperative Language

- 98,831 stencils
- 17.5 megabytes
- 14 minutes to compile

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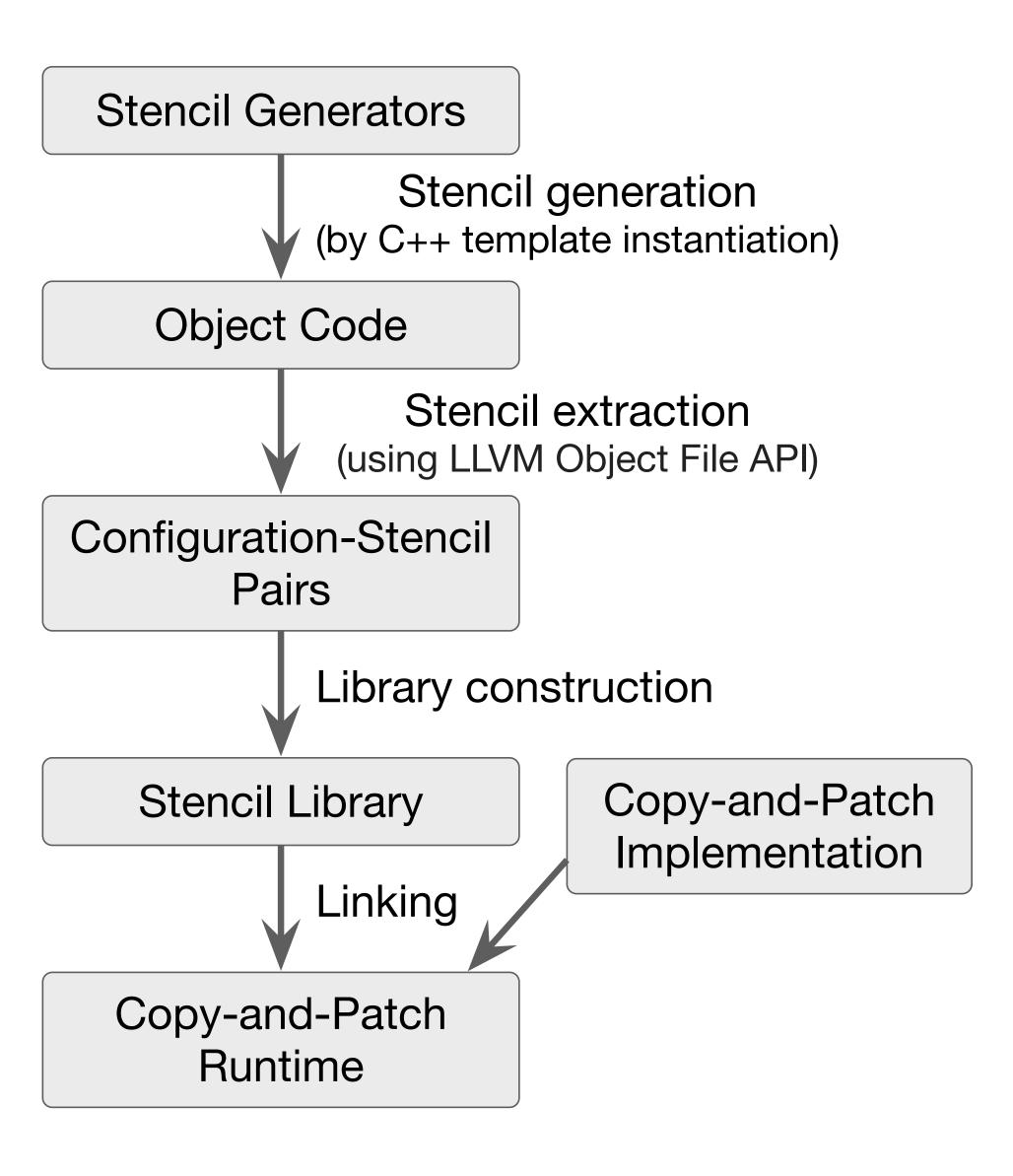
- 1666 stencils
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High-Level Imperative Language

- 98,831 stencils
- 17.5 megabytes
- 14 minutes to compile

How can we create all of these stencils?

We write variant groups in C++ using templates and Clang+LLVM compiles them for us



Continuation-passing style and tail call optimization

Typical recursive interpreter code

```
int evaluate()
{
   int lhs = evaluate_lhs();
   int rhs = evaluate_rhs();
   return lhs + rhs;
}
```

Continuation-passing style and tail call optimization

Typical recursive interpreter code

```
int evaluate()
{
   int lhs = evaluate_lhs();
   int rhs = evaluate_rhs();
   return lhs + rhs;
}
```

Faster continuation-passing style

$$(a + +b) = c$$

```
void eq_int(uintptr_t stack, int lhs, int rhs) {
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, bool) 1 )(stack, result);
}
```

```
void eq_int(uintptr_t stack, int lhs, int rhs) {
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, bool) 1 )(stack, result);
}
```

Registers operands lhs and rhs

```
void eq_int(uintptr_t stack, int lhs, int rhs) {
  bool result = (lhs == rhs);
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}
```

Call next operation

Registers operands lhs and rhs

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void eq_int(uintptr_t stack, int lhs, int rhs) {
  bool result = (lhs == rhs);
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}
```

Call next operation

```
void eq_int_lvar_rconst(uintptr_t stack) {
  int lhs = *(int*)(stack + 1);
  int rhs = 2;
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, bool) 3)(stack, result);
}
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Registers operands lhs and rhs

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```
Call next operation
```

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```
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  bool result = (lhs == rhs);
  (void(*)(uintptr_t, bool) 1)(stack, result);
}
```

Call next operation

```
void if(uintptr_t stack, bool test) {
  if (test)
    (void(*)(uintptr_t) 1)(stack);
  else
    (void(*)(uintptr_t) 2)(stack);
}
```

```
void eq_int_lvar_rconst(uintptr_t stack) {
  int lhs = *(int*)(stack + 1);
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Call next operation
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void if(uintptr_t stack, bool test) {
  if (test)
    (void(*)(uintptr_t) 1)(stack);
  else
    (void(*)(uintptr_t) 2)(stack);
}
```

```
void eq_int_pt(uintptr_t stack, uint64_t r1, int rhs) {
  int lhs = 1;
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, uint64_t, bool) 2)(stack, r1, result);
}
```

Registers operands lhs and rhs

```
void eq_int(uintptr_t stack, int lhs, int rhs) {
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, bool) 1)(stack, result);
}
```

Call next operation

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void eq_int_lvar_rconst(uintptr_t stack) {
  int lhs = *(int*)(stack + 1);
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```

```
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  int lhs = 1;
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, uint64_t, bool) 2)(stack, r1, result);
}
```

Register communicated from a previous operation to a later operations

Register pass-through

```
void stencil1(uintptr_t stack) {
 int x = /* assign value to x */;
 (void(*)(uintptr_t, int) (stack, x);
void stencil2(uintptr_t stack, uint64_t x) {
  // computation unrelated to x
  void stencil3(uintptr_t stack, int x) {
  // do something with x
```

```
void eq_int_lvar_rconst(uintptr_t stack) {
  int lhs = *(int*)(stack + 1);
  int rhs = 2;
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, bool) 3)(stack, result);
}
```

```
extern int hole_1();
...
int lhs = hole_1();

void eq_int_lvar_rconst(uintptr_t stack) {
  int lhs = *(int*)(stack + 1);
  int rhs = 2;
  bool result = (lhs == rhs);
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  (void(*)(uintptr_t, bool) 3)(stack, result);
}
```

1. C++ compiler generates an object file

```
extern int hole_1();
...
int lhs = hole_1();

void eq_int_lvar_rconst(uintptr_t stack) {
  int lhs = *(int*)(stack + 1);
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  (void(*)(uintptr_t, bool) 3)(stack, result);
}
```

- 1. C++ compiler generates an object file
- 2. The linker can link object files to any definition of the extern calls

```
extern int hole_1();
...
int lhs = hole_1();

void eq_int_lvar_rconst(ui)tptr_t stack) {
  int lhs = *(int*)(stack + 1);
  int rhs = 2;
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, bool) 3)(stack, result);
}
```

- 1. C++ compiler generates an object file
- 2. The linker can link object files to any definition of the extern calls
- 3. The object file thus contains information to locate them in the binary code

```
extern int hole_1();
...
int lhs = hole_1();

void eq_int_lvar_rconst(uintptr_t stack) {
  int lhs = *(int*)(stack + 1);
  int rhs = 2;
  bool result = (lhs == rhs);
  (void(*)(uintptr_t, bool) 3)(stack, result);
}
```

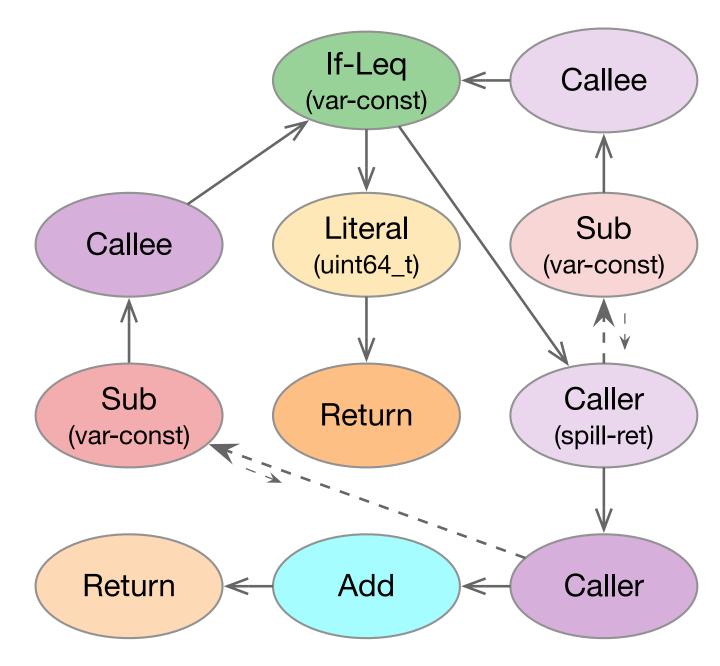
- 1. C++ compiler generates an object file
- 2. The linker can link object files to any definition of the extern calls
- 3. The object file thus contains information to locate them in the binary code
- 4. We can use this information to locate holes in stencils for later patching

Using templates we can generate groups of variants

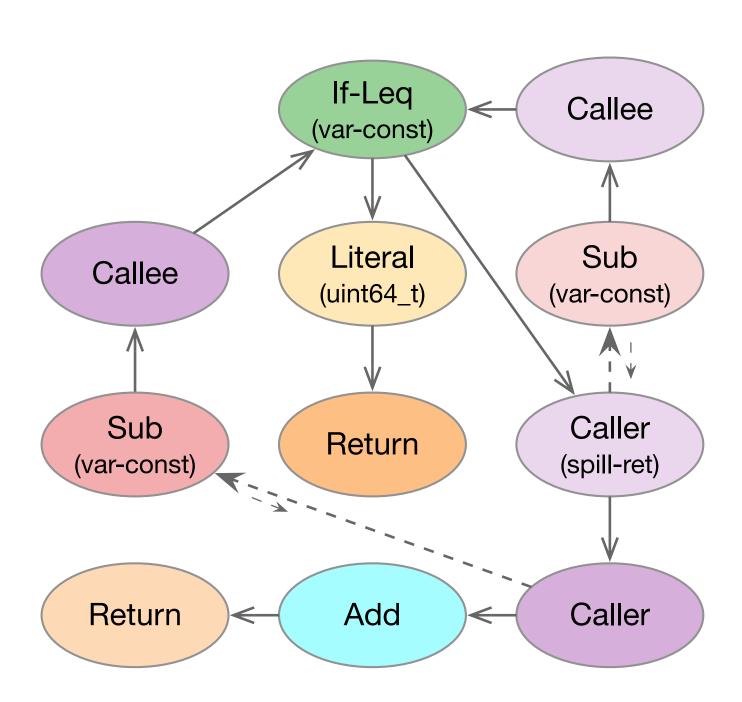
```
struct ArithAdd {
  template<typename T /* OperandType */,</pre>
           bool spillOutput,
           NumPassthroughs numPassThroughs,
           typename... Passthroughs>
  static void g(uintptr_t stack, Passthroughs... pt, T a, T b) {
   Tc = a + b;
    if constexpr (! spillOutput) {
     DEF_CONTINUATON_0(void(*)(uintptr_t, Passthroughs...,T));
     CONTINUATON_0(stack, pt..., c); // continuation
   } else {
     DEF_CONSTANT_1(uint64_t);
      *(T*)(stack + CONSTANT_1) = c;
     DEF_CONTINUATON_0(void(*)(uintptr_t, Passthroughs...));
      CONTINUATON_0(stack, pt...); // continuation
  template<typename T /* OperandType */,</pre>
          bool spillOutput,
           NumPassthroughs numPassThroughs>
  static constexpr bool f() {
    if (numPt > numMaxPassthroughs - 2) return false;
   return !std::is_same<T, void>::value;
  static auto metavars() {
    return createMetaVarList(
      typeMetaVar(),
      boolMetaVar(),
      enumMetaVar<NumPassthroughs::X_END_OF_ENUM>());
extern "C" void generate(StencilList* result) {
  runStencilGenerator<ArithAdd>(result);
```

Fibonacci compilation example

Fibonacci compilation example

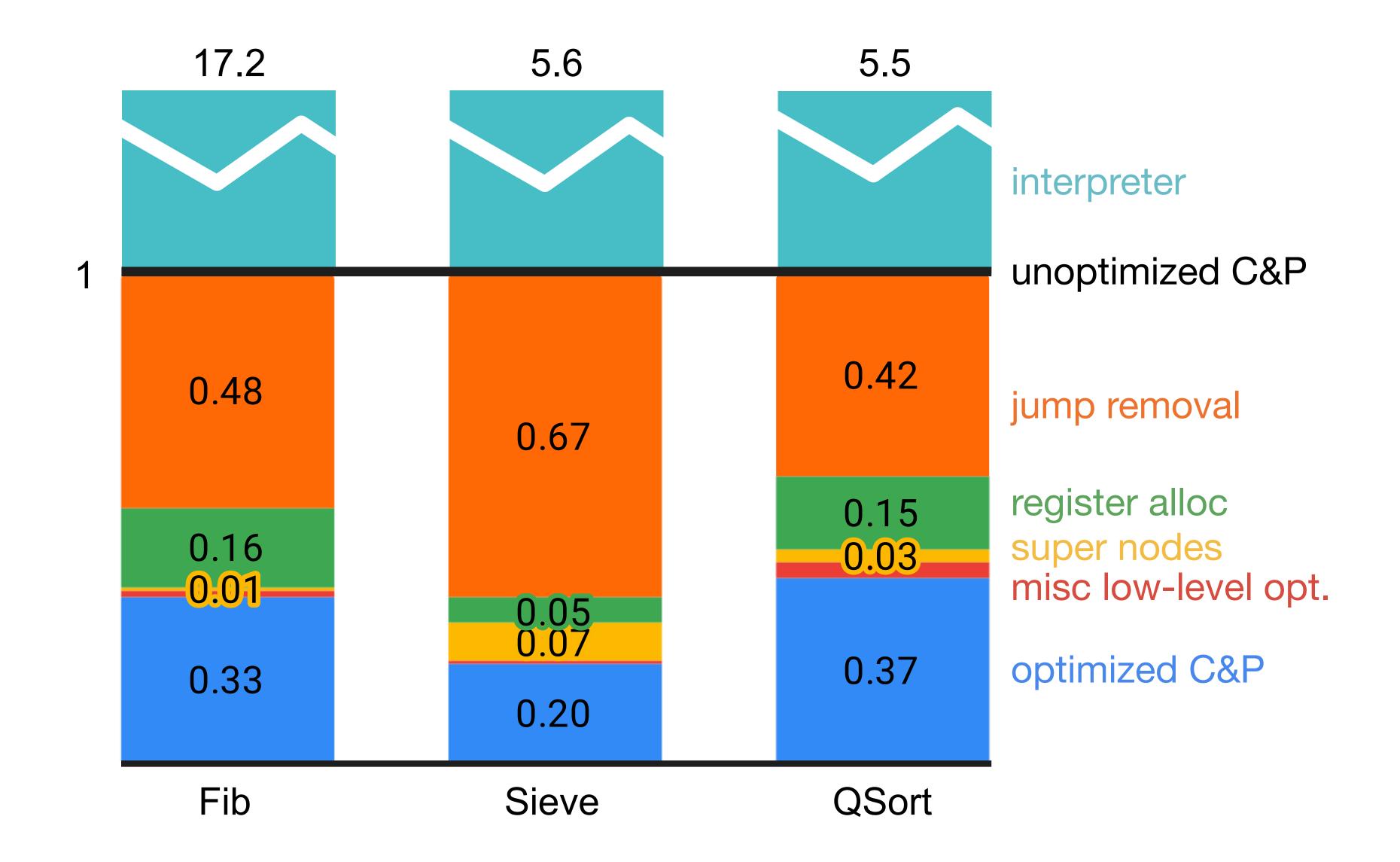


Fibonacci compilation example



```
00:
             0x8(%r13),%r12d
      mov
             $0x2,%eax
      mov
0c:
      sub
             %eax,%r12d
0f:
             %r12d, 0x8(%rbp)
      mov
13:
             %rbp,%r13
      mov
             $0x2, %eax ← fib function entry
20:
      mov
25:
             %eax, 0x8(%r13)
      cmp
2c:
      jg
32:
      movabs $0x1,%rbp
3c:
             %rbp,%rax
      mov
3f:
      retq
40:
      sub
             $0x38,%rsp
44:
             %r13,0x8(%rsp)
      mov
49:
      lea
             0x10(%rsp),%rbp
      callq
4e:
53:
             0x8(%rsp),%r13
      mov
             %rax,0x10(%r13) \leftarrow only spilled value
58:
      mov
5f:
      add
             $0x38,%rsp
63:
      sub
             $0x38,%rsp
67:
             %r13,0x8(%rsp)
      mov
6c:
      lea
             0x10(%rsp),%rbp
      callq
76:
             0x8(%rsp),%r13
      mov
7b:
             %rax,%rbp
      mov
             $0x38,%rsp
7e:
      add
                          jumps between
             0x10(%r13), %rbp
82:
      add
                               consecutive code
89:
             %rbp,%rax
      mov
                               blocks are removed
      retq
90:
             0x8(%r13),%r12d
      mov
97:
             $0x1,%eax
      mov
9c:
      sub
             %eax,%r12d
9f:
             %r12d, 0x8(%rbp)
      mov
a3:
             %rbp,%r13
      mov
a6:
             20
      jmpq
```

Execution performance breakdown



Final copy-and-patch performance

Final copy-and-patch performance

WebAssembly Baseline Compiler

	Compilation Speedup	Execution Speedup
Google Chrome Liftoff (baseline compiler)	4.9 – 6.5	1.46 – 1.63
Google Chrome TurboFan (optimizing compiler)	30 - 47 (small module) 88 - 91 (large module)	0.69 – 0.85

Final copy-and-patch performance

WebAssembly Baseline Compiler

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High-level imperative language (for metaprogramming)

	Compilation Speedup	Execution Speedup
Interpreter	0.3 – 0.5	6 – 36
LLVM -O0	79 – 267	1.02 – 1.57
LLVM -O2	936 – 1384	0.61 - 0.96