Making CPython 3.11 Fast

Inside Python's new specializing, adaptive interpreter.

Making CPython 3.11 Especially Fast

Inside Python's new specializing, adaptive interpreter.

Brandt Bucher

Brandt Bucher

- 2017: Started using Python.
- 2018: Contributed code to CPython.
- 2019: Joined Python's Triage Team.
- 2020: Joined Python's Core Development Team.
- 2021: Joined Microsoft's CPython Performance Engineering Team.
- 2022: Made CPython faster!

```
class Point:
    def init (self, x: float, y: float) -> None:
        self.x = x
        self.y = y
    def shifted(self, dx: float, dy: float) -> typing.Self:
        x = dx + self.x
        y = dy + self.y
        cls = type(self)
        return cls(x, y)
```

```
y = dy + self.y
cls = type(self)
```

```
y = dy + self.y
cls = type(self)
```

```
import dis
dis.dis(Point.shifted)
```

```
y = dy + self.y
cls = type(self)
```

```
(dy)
y = dy + self.y
                             LOAD FAST
cls = type(self)
                             LOAD FAST (self)
                             LOAD ATTR
                                        (y)
                             BINARY OP (+)
                             STORE FAST
                                       (y)
                             LOAD GLOBAL (type)
                             LOAD FAST (self)
                             PRECALL
                                         (1)
                                         (1)
                             CALL
                             STORE_FAST (cls)
```

```
y = dy + self.y
                   LOAD FAST (dy)
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                               (y)
                   BINARY OP (+)
                   STORE FAST (y)
                   LOAD GLOBAL (type)
                   LOAD FAST (self)
                                              stack
                   PRECALL
                               (1)
                   CALL
                               (1)
                   STORE FAST
```

```
y = dy + self.y
                   LOAD FAST (dy)
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                               (y)
                   BINARY OP (+)
                   STORE FAST (y)
                   LOAD GLOBAL (type)
                                              stack
                   LOAD FAST (self)
                                               dy
                   PRECALL
                               (1)
                   CALL
                               (1)
                   STORE FAST
```

```
y = dy + self.y
                   LOAD FAST (dy)
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                               (y)
                   BINARY OP (+)
                                              stack
                   STORE FAST (y)
                   LOAD GLOBAL (type)
                                              self
                   LOAD FAST (self)
                                               dy
                   PRECALL
                               (1)
                   CALL
                               (1)
                   STORE FAST
```

```
y = dy + self.y
                   LOAD FAST (dy)
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                               (y)
                   BINARY OP (+)
                   STORE FAST (y)
                                              stack
                   LOAD GLOBAL (type)
                                             self.y
                   LOAD FAST (self)
                                               dy
                   PRECALL
                               (1)
                   CALL
                               (1)
                   STORE FAST
```

```
y = dy + self.y
                   LOAD FAST (dy)
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                               (y)
                   BINARY OP (+)
                   STORE FAST
                              (y)
                   LOAD GLOBAL (type)
                                             stack
                   LOAD FAST (self)
                                         dy + self.y
                   PRECALL
                               (1)
                   CALL
                               (1)
                   STORE FAST
```

```
y = dy + self.y
                  LOAD FAST (dy) y = dy + self.y
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                              (y)
                   BINARY OP (+)
                   STORE FAST
                              (y)
                   LOAD GLOBAL (type)
                   LOAD FAST (self)
                                             stack
                   PRECALL
                              (1)
                   CALL
                              (1)
                   STORE FAST
```

```
y = dy + self.y
                  LOAD FAST (dy) y = dy + self.y
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                              (y)
                   BINARY OP (+)
                   STORE FAST
                              (y)
                   LOAD GLOBAL (type)
                                             stack
                   LOAD FAST (self)
                                             type
                   PRECALL
                              (1)
                   CALL
                              (1)
                   STORE FAST
```

```
y = dy + self.y
                   LOAD FAST (dy) y = dy + self.y
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                              (y)
                   BINARY OP (+)
                   STORE FAST
                                             stack
                              (y)
                   LOAD GLOBAL (type)
                                             self
                   LOAD FAST (self)
                                              type
                   PRECALL
                              (1)
                   CALL
                              (1)
                   STORE FAST
```

```
y = dy + self.y
                   LOAD FAST (dy) y = dy + self.y
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                              (y)
                   BINARY OP (+)
                   STORE FAST
                                             stack
                              (y)
                   LOAD GLOBAL (type)
                                             self
                   LOAD FAST (self)
                                              type
                   PRECALL
                              (1)
                   CALL
                              (1)
                   STORE FAST
```

```
LOAD FAST (dy) y = dy + self.y
y = dy + self.y
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                              (y)
                   BINARY OP (+)
                   STORE FAST
                              (y)
                   LOAD GLOBAL (type)
                                             stack
                   LOAD FAST (self)
                                          type(self)
                   PRECALL
                              (1)
                              (1)
                   CALL
                   STORE FAST
```

```
y = dy + self.y
                  LOAD FAST (dy) y = dy + self.y
                  LOAD FAST (self) cls = type(self)
cls = type(self)
                  LOAD ATTR
                              (y)
                  BINARY OP (+)
                  STORE FAST (y)
                  LOAD GLOBAL (type)
                  LOAD FAST (self)
                                            stack
                  PRECALL
                              (1)
                              (1)
                  CALL
                   STORE FAST (cls)
```

```
y = dy + self.y
                   LOAD FAST (dy)
cls = type(self)
                   LOAD FAST (self)
                   LOAD ATTR
                               (y)
                   BINARY OP (+)
                   STORE FAST (y)
                   LOAD GLOBAL (type)
                   LOAD FAST (self)
                                              stack
                   PRECALL
                               (1)
                   CALL
                               (1)
                   STORE FAST
```

```
y = dy + self.y
                                                       (dy)
                           LOAD FAST
cls = type(self)
                           LOAD FAST
                                                       (self)
                           LOAD ATTR
                                                       (y)
                           BINARY OP
                                                       (+)
                           STORE FAST
                                                       (y)
                           LOAD GLOBAL
                                                       (type)
                           LOAD FAST
                                                       (self)
                           PRECALL
                                                       (1)
                           CALL
                                                       (1)
                                                      (cls)
                           STORE_FAST
```

Quickening

```
y = dy + self.y
                                                       (dy)
                           LOAD FAST
cls = type(self)
                           LOAD FAST
                                                       (self)
                           LOAD ATTR
                                                       (y)
                           BINARY OP
                                                       (+)
                           STORE FAST
                                                       (y)
                           LOAD GLOBAL
                                                       (type)
                                                       (self)
                           LOAD FAST
                           PRECALL
                                                       (1)
                           CALL
                                                       (1)
                                                       (cls)
                           STORE FAST
```

Quickening

```
y = dy + self.y
                           LOAD FAST
                                                       (dy)
cls = type(self)
                           LOAD FAST
                                                       (self)
                           LOAD ATTR
                                                       (y)
                           BINARY OP
                                                       (+)
                           STORE FAST
                                                       (y)
                           LOAD GLOBAL
                                                      (type)
                                                       (self)
                           LOAD FAST
                           PRECALL
                                                       (1)
                           CALL
                                                       (1)
                           STORE FAST
                                                      (cls)
```

Superinstructions

```
y = dy + self.y
                           LOAD FAST
                                                       (dy)
cls = type(self)
                           LOAD FAST
                                                       (self)
                           LOAD ATTR
                                                       (y)
                           BINARY OP
                                                       (+)
                           STORE FAST
                                                       (y)
                           LOAD GLOBAL
                                                       (type)
                                                       (self)
                           LOAD FAST
                                                       (1)
                           PRECALL
                                                       (1)
                           CALL
                           STORE FAST
                                                      (cls)
```

Superinstructions

```
y = dy + self.y
                           LOAD FAST
                                                       (dy)
cls = type(self)
                           LOAD FAST
                                                       (self)
                           LOAD ATTR
                                                       (y)
                           BINARY OP
                                                      (+)
                           STORE FAST
                                                       (y)
                           LOAD GLOBAL
                                                      (type)
                                                       (self)
                           LOAD FAST
                                                      (1)
                           PRECALL
                                                       (1)
                           CALL
                           STORE FAST
                                                      (cls)
```

Superinstructions

```
LOAD FAST LOAD FAST
y = dy + self.y
                                                      (dy, self)
cls = type(self)
                          LOAD ATTR
                                                      (y)
                           BINARY OP
                                                      (+)
                           STORE FAST
                                                      (y)
                          LOAD GLOBAL
                                                      (type)
                          LOAD FAST
                                                      (self)
                                                      (1)
                           PRECALL
                                                      (1)
                           CALL
                                                      (cls)
                           STORE FAST
```

Adaptive Instructions

```
y = dy + self.y
                          LOAD FAST LOAD FAST
                                                      (dy, self)
cls = type(self)
                          LOAD ATTR
                                                      (y)
                           BINARY OP
                                                      (+)
                           STORE FAST
                                                      (y)
                           LOAD GLOBAL
                                                      (type)
                           LOAD FAST
                                                      (self)
                                                      (1)
                           PRECALL
                                                      (1)
                           CALL
                                                      (cls)
                           STORE FAST
```

Adaptive Instructions

```
LOAD FAST LOAD FAST
y = dy + self.y
                                                     (dy, self)
cls = type(self)
                          LOAD ATTR ADAPTIVE
                                                     (y)
                          BINARY OP ADAPTIVE
                                                     (+)
                          STORE FAST
                                                     (y)
                          LOAD GLOBAL ADAPTIVE
                                                     (type)
                                                     (self)
                          LOAD FAST
                          PRECALL ADAPTIVE
                                                     (1)
                          CALL ADAPTIVE
                                                     (1)
                          STORE FAST
                                                     (cls)
```

```
LOAD FAST LOAD FAST
y = dy + self.y
                                                    (dy, self)
cls = type(self)
                          LOAD ATTR ADAPTIVE
                                                    (y)
                          BINARY OP ADAPTIVE
                                                    (+)
                                                    (y)
                          STORE FAST
                          LOAD GLOBAL ADAPTIVE
                                                    (type)
                                                     (self)
                          LOAD FAST
                                                     (1)
                          PRECALL ADAPTIVE
                          CALL ADAPTIVE
                                                     (1)
                                                     (cls)
                          STORE FAST
```

```
LOAD FAST LOAD FAST
y = dy + self.y
                                                     (dy, self)
cls = type(self)
                          LOAD ATTR ADAPTIVE
                                                     (y)
                          BINARY OP ADAPTIVE
                                                     (+)
                          STORE FAST
                                                     (y)
                          LOAD GLOBAL ADAPTIVE
                                                     (type)
                                                     (self)
                          LOAD FAST
                                                     (1)
                          PRECALL ADAPTIVE
                          CALL ADAPTIVE
                                                     (1)
                                                     (cls)
                          STORE FAST
```

```
(dy, self)
                         LOAD_FAST LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADAPTIVE
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL ADAPTIVE
                                                    (type)
                                                    (self)
                         LOAD FAST
                          PRECALL ADAPTIVE
                                                    (1)
                                                    (1)
                          CALL ADAPTIVE
                          STORE FAST
                                                    (cls)
```

LOAD ATTR INSTANCE VALUE

- Check if the class is the same as last time.
- Check if the object's dict keys are the same as last time.
- Reach directly into the ___dict__ values at the same offset as last time.
- Return the result.

LOAD_ATTR_INSTANCE_VALUE

- Check if the class is the same as last time.
- Check if the object's __dict_ keys are the same as last time.
- Reach directly into the ___dict__ values at the same offset as last time.
- Return the result.

```
(dy, self)
                         LOAD_FAST LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADAPTIVE
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL ADAPTIVE
                                                    (type)
                                                    (self)
                         LOAD FAST
                          PRECALL ADAPTIVE
                                                    (1)
                                                    (1)
                          CALL ADAPTIVE
                          STORE FAST
                                                    (cls)
```

```
(dy, self)
                         LOAD FAST LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADAPTIVE
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL ADAPTIVE
                                                    (type)
                                                    (self)
                         LOAD FAST
                          PRECALL ADAPTIVE
                                                    (1)
                                                    (1)
                          CALL ADAPTIVE
                                                    (cls)
                          STORE FAST
```

```
(dy, self)
                         LOAD_FAST_ LOAD FAST
y = dy + self.y
cls = type(self)
                          LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL ADAPTIVE
                                                    (type)
                                                    (self)
                          LOAD FAST
                          PRECALL ADAPTIVE
                                                    (1)
                          CALL ADAPTIVE
                                                    (1)
                                                    (cls)
                          STORE FAST
```

BINARY OP ADD FLOAT

- Check if the left object's class is float.
- Check if the right object's class is float.
- Add the values together.
- Return the result.

BINARY OP ADD FLOAT

- Check if the left object's class is float.
- Check if the right object's class is float.
- Add the values together.
- Return the result.

```
(dy, self)
                         LOAD_FAST_ LOAD FAST
y = dy + self.y
cls = type(self)
                          LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL ADAPTIVE
                                                    (type)
                                                    (self)
                          LOAD FAST
                          PRECALL ADAPTIVE
                                                    (1)
                          CALL ADAPTIVE
                                                    (1)
                                                    (cls)
                          STORE FAST
```

```
(dy, self)
                         LOAD_FAST_ LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL ADAPTIVE
                                                    (type)
                                                    (self)
                          LOAD FAST
                          PRECALL ADAPTIVE
                                                    (1)
                          CALL ADAPTIVE
                                                    (1)
                                                    (cls)
                          STORE FAST
```

```
(dy, self)
                         LOAD_FAST_ LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                          LOAD FAST
                                                    (1)
                          PRECALL ADAPTIVE
                          CALL ADAPTIVE
                                                    (1)
                                                    (cls)
                          STORE FAST
```

LOAD GLOBAL BUILTIN

- Check if the globals dictionary keys are the same as last time.
- Check if the built-in dictionary keys are the same as last time.
- Reach directly into the built-in values at the same offset as last time.
- Return the result.

LOAD GLOBAL BUILTIN

- Check if the globals dictionary keys are the same as last time.
- Check if the built-in dictionary keys are the same as last time.
- Reach directly into the built-in values at the same offset as last time.
- Return the result.

```
(dy, self)
                         LOAD_FAST_ LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                          LOAD FAST
                                                    (1)
                          PRECALL ADAPTIVE
                          CALL ADAPTIVE
                                                    (1)
                                                    (cls)
                          STORE FAST
```

```
(dy, self)
                         LOAD_FAST_ LOAD FAST
y = dy + self.y
cls = type(self)
                          LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                          LOAD FAST
                          PRECALL ADAPTIVE
                                                    (1)
                          CALL ADAPTIVE
                                                    (1)
                          STORE FAST
                                                    (cls)
```

```
(dy, self)
y = dy + self.y
                         LOAD FAST LOAD FAST
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                          LOAD FAST
                          PRECALL NO KW TYPE 1
                                                    (1)
                          STORE FAST
                                                    (cls)
```

PRECALL NO KW TYPE 1

- Check if the object we're calling is still type.
- Get the argument's class.
- Return the result.

PRECALL NO KW TYPE 1

- Check if the object we're calling is still type.
- Get the argument's class.
- Return the result.

PRECALL NO KW TYPE 1

```
(dy, self)
y = dy + self.y
                         LOAD FAST LOAD FAST
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                          LOAD FAST
                          PRECALL NO KW TYPE 1
                                                    (1)
                          STORE FAST
                                                    (cls)
```

```
(dy, self)
y = dy + self.y
                         LOAD FAST LOAD FAST
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                          LOAD FAST
                          PRECALL NO KW TYPE 1
                                                    (1)
                          STORE FAST
                                                    (cls)
```

```
(dy, self)
y = dy + self.y
                         LOAD FAST LOAD FAST
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADD FLOAT
                                                    (+)
                          STORE FAST
                                                    (y)
                          LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                          LOAD FAST
                          PRECALL NO KW TYPE 1
                                                    (1)
                          STORE FAST
                                                    (cls)
```

```
(dy, self)
                         LOAD_FAST_ LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                    (y)
                          BINARY OP ADAPTIVE
                                                    (+)
                          STORE FAST
                                                    (y)
                         LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                         LOAD FAST
                          PRECALL NO KW TYPE 1
                                                    (1)
                          STORE FAST
                                                    (cls)
```

```
(dy, self)
                         LOAD FAST LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                   (y)
                         BINARY OP ADD INT
                                                    (+)
                         STORE FAST
                                                    (y)
                         LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                         LOAD FAST
                         PRECALL NO KW TYPE 1
                                                    (1)
                         STORE FAST
                                                    (cls)
```

```
(dy, self)
                         LOAD FAST LOAD FAST
y = dy + self.y
cls = type(self)
                         LOAD ATTR INSTANCE VALUE
                                                   (y)
                         BINARY OP ADD INT
                                                    (+)
                         STORE FAST
                                                    (y)
                         LOAD GLOBAL BUILTIN
                                                    (type)
                                                    (self)
                         LOAD FAST
                         PRECALL NO KW TYPE 1
                                                    (1)
                         STORE FAST
                                                    (cls)
```

```
LOAD_FAST__LOAD_FAST (dy, self)
LOAD_ATTR_INSTANCE_VALUE (y)
BINARY_OP_ADD_INT (+)
STORE_FAST (y)
LOAD_GLOBAL_BUILTIN (type)
LOAD_FAST (self)
PRECALL_NO_KW_TYPE_1 (1)
STORE_FAST (cls)
```

```
LOAD_FAST__LOAD_FAST (dy, self)
LOAD_ATTR_INSTANCE_VALUE (y)
BINARY_OP_ADD_INT (+)
STORE_FAST (y)
LOAD_GLOBAL_BUILTIN (type)
LOAD_FAST (self)
PRECALL_NO_KW_TYPE_1 (1)
STORE_FAST (cls)
```

dis.dis(Point.shifted, adaptive=True, show_caches=True)

```
LOAD_FAST__LOAD_FAST (dy, self)
LOAD_ATTR_INSTANCE_VALUE (y)
BINARY_OP_ADD_INT (+)
STORE_FAST (y)
LOAD_GLOBAL_BUILTIN (type)
LOAD_FAST (self)
PRECALL_NO_KW_TYPE_1 (1)
STORE_FAST (cls)
```

dis.dis(Point.shifted, adaptive=True, show_caches=True)

```
LOAD_FAST__LOAD_FAST
                          (dy, self)
LOAD_ATTR_INSTANCE_VALUE
                           (y)
CACHE
                           (counter)
CACHE
                           (version)
                           (version)
CACHE
CACHE
                           (index)
BINARY_OP_ADD_INT
                           (+)
CACHE
                           (counter)
STORE_FAST
                           (y)
LOAD_GLOBAL_BUILTIN
                           (type)
CACHE
                           (counter)
                           (index)
CACHE
CACHE
                           (version)
                           (version)
CACHE
                           (version)
CACHE
                           (self)
LOAD FAST
PRECALL NO KW TYPE 1
                           (1)
                           (counter)
                           (cls)
STORE_FAST
```

```
LOAD_FAST__LOAD_FAST (dy, self)
LOAD_ATTR_INSTANCE_VALUE (y)
BINARY_OP_ADD_INT (+)
STORE_FAST (y)
LOAD_GLOBAL_BUILTIN (type)
LOAD_FAST (self)
PRECALL_NO_KW_TYPE_1 (1)
STORE_FAST (cls)
```

dis.dis(Point.shifted)

```
LOAD FAST
           (dy)
LOAD FAST (self)
LOAD ATTR
          (y)
BINARY OP
          (+)
STORE FAST
          (y)
LOAD GLOBAL (type)
LOAD FAST (self)
PRECALL
            (1)
CALL
            (1)
STORE_FAST
```

Bytecode

```
LOAD GLOBAL BUILTIN (type)
RESUME_QUICK
LOAD_FAST__LOAD_FAST (dx) LOAD_FAST (self)
              (self) PRECALL_NO_KW_TYPE_1 (1)
LOAD FAST
LOAD_ATTR_INSTANCE_VALUE (x) CALL_ADAPTIVE (1)
BINARY_OP_ADD_FLOAT (+) STORE_FAST
                                           (cls)
STORE_FAST__LOAD_FAST (x) PUSH_NULL
LOAD_FAST_LOAD_FAST (dy) LOAD_FAST_LOAD_FAST (cls)
LOAD_FAST (self) LOAD_FAST_LOAD_FAST (x)
LOAD ATTR INSTANCE_VALUE (y) LOAD_FAST
                                           (y)
BINARY OP ADD FLOAT (+) PRECALL_ADAPTIVE (2)
                    (y)
                          CALL_ADAPTIVE
STORE_FAST
                          RETURN VALUE
```

Bytecode

```
LOAD_GLOBAL_BUILTIN (type)
RESUME_QUICK
LOAD_FAST__LOAD_FAST (dx) LOAD_FAST (self)
LOAD_FAST (self) PRECALL_NO_KW_TYPE_1 (1)
LOAD_ATTR_INSTANCE_VALUE (x) CALL_ADAPTIVE (1)
BINARY OP ADD FLOAT (+) STORE FAST
                                           (cls)
STORE_FAST__LOAD_FAST (x) PUSH_NULL
LOAD_FAST_LOAD_FAST (dy) LOAD_FAST_LOAD_FAST (cls)
LOAD_FAST (self) LOAD_FAST LOAD_FAST (x)
LOAD ATTR_INSTANCE_VALUE (y) LOAD_FAST
                                           (y)
BINARY OP ADD FLOAT (+) PRECALL ADAPTIVE (2)
                    (y)
                          CALL_ADAPTIVE
STORE_FAST
                          RETURN VALUE
```

Bytecode

```
LOAD_GLOBAL_BUILTIN (type)
RESUME_QUICK
LOAD_FAST__LOAD_FAST (dx) LOAD_FAST (self)
LOAD_FAST (self) PRECALL_NO_KW_TYPE_1 (1)
LOAD_ATTR_INSTANCE_VALUE (x) CALL_ADAPTIVE (1)
BINARY OP ADD FLOAT (+) STORE FAST
                                          (cls)
STORE_FAST_LOAD_FAST (x) PUSH_NULL
LOAD_FAST_LOAD_FAST (dy) LOAD_FAST_LOAD_FAST (cls)
LOAD_FAST (self) LOAD_FAST LOAD_FAST (x)
LOAD_ATTR_INSTANCE_VALUE (y) LOAD_FAST
                                           (y)
BINARY OP ADD FLOAT (+) PRECALL ADAPTIVE (2)
                          CALL_ADAPTIVE (2)
                    (y)
STORE_FAST
                          RETURN VALUE
```

```
LOAD_GLOBAL_BUILTIN (type)
RESUME_QUICK
LOAD_FAST__LOAD_FAST (dx) LOAD_FAST (self)
              (self) PRECALL_NO_KW_TYPE_1 (1)
LOAD_FAST
LOAD_ATTR_INSTANCE_VALUE (x) CALL_ADAPTIVE
                   (+)
BINARY_OP_ADD_FLOAT
                          STORE_FAST
                                            (cls)
STORE_FAST_LOAD_FAST (x) PUSH_NULL
LOAD_FAST__LOAD_FAST (dy) LOAD_FAST_LOAD_FAST (cls)
LOAD_FAST (self) LOAD_FAST LOAD_FAST (x)
LOAD_ATTR_INSTANCE_VALUE (y) LOAD_FAST
                                            (y)
                   (+) PRECALL_ADAPTIVE
BINARY OP ADD FLOAT
STORE_FAST
                    (y)
                          CALL_ADAPTIVE
                          RETURN VALUE
```

```
LOAD GLOBAL_BUILTIN (type)
x = dx + self.x
                             LOAD_FAST (self)
                             PRECALL_NO_KW_TYPE_1 (1)
                             CALL ADAPTIVE
                             STORE_FAST
                                                (cls)
                             PUSH NULL
LOAD_FAST__LOAD_FAST (dy) LOAD_FAST__LOAD_FAST (cls)
                    (self) LOAD_FAST__LOAD_FAST (x)
LOAD FAST
                      (y) LOAD_FAST
LOAD_ATTR_INSTANCE_VALUE
                                                (y)
BINARY OP ADD FLOAT
                      (+) PRECALL_ADAPTIVE
                      (y)
STORE_FAST
                             CALL_ADAPTIVE
                             RETURN VALUE
```

```
x = dx + self.x
y = dy + self.y
```

```
LOAD GLOBAL_BUILTIN (type)
LOAD_FAST (self)
PRECALL NO KW TYPE 1 (1)
CALL ADAPTIVE
                  (cls)
STORE_FAST
PUSH NULL
LOAD FAST LOAD FAST (cls)
LOAD FAST LOAD FAST (x)
LOAD FAST
                  (y)
PRECALL ADAPTIVE
CALL_ADAPTIVE
RETURN VALUE
```

```
x = dx + self.x
                              cls = type(self)
y = dy + self.y
                              LOAD FAST LOAD FAST (cls)
                              LOAD FAST LOAD FAST (x)
                              LOAD_FAST
                                                 (y)
                              PRECALL_ADAPTIVE
                              CALL_ADAPTIVE (2)
                              RETURN_VALUE
```

```
x = dx + self.x cls = type(self)
```

$$y = dy + self.y$$
 return $cls(x, y)$

```
class Point:
    def init (self, x: float, y: float) -> None:
        self.x = x
        self.y = y
    def shifted(self, dx: float, dy: float) -> typing.Self:
        x = dx + self.x
        y = dy + self.y
        cls = type(self)
        return cls(x, y)
```

```
class Point:
    def init (self, x: float, y: float) -> None:
        self.x = x
        self.y = y
    def shifted(self, dx: float, dy: float) -> typing.Self:
        x = dx + self.x
        y = dy + self.y
        cls = type(self)
        return cls(x, y)
```

Specialist

```
class Point:
    def init (self, x: float, y: float) -> None:
        self.x = x
        self.y = y
    def shifted(self, dx: float, dy: float) -> typing.Self:
        x = dx + self.x
        y = dy + self.y
        cls = type(self)
        return cls(x, y)
```

Specialist

\$ specialist --blue point.py

```
class Point:
    def init (self, x: float, y: float) -> None:
        self.x = x
        self.y = y
    def shifted(self, dx: float, dy: float) -> typing.Self:
        x = dx + self.x
       y = dy + self.y
        cls = type(self)
        return cls(x, y)
```

Specialist --blue point.py

```
import typing
class Point:
    def __init__(self, x: float, y: float) -> None:
        self.x = x
        self.y = y
    def shifted(self, dx: float, dy: float) -> typing.Self:
       x = dx + self.x
       y = dy + self.y
        cls = type(self)
        return cls(x, y)
def actually_run_something() -> None:
    p = Point(3.14, 2.72)
   for i in range(100):
        p = p.shifted(19.95, 12.06)
if __name__ == "__main__":
    actually_run_something()
```

Specialist

\$ specialist --blue point.py

```
def actually_run_something() -> None:
    p = Point(3.14, 2.72)
    for i in range(100):
        p = p.shifted(19.95, 12.06)

if __name__ == "__main__":
    actually_run_something()
```

Specialist brandtbucher/specialist

Specialist



Specialist uses fine-grained location information to create visual representations of exactly where and how CPython 3.11's new specializing, adaptive interpreter optimizes your code.

```
def encode_decode(key: str, text: str) -> str:
    out = []
    for i, t in enumerate(text):
        k = key[i % len(key)]
        out.append(chr(ord(t) ^ ord(k)))
    return "".join(out)
```

Installation

Specialist supports CPython 3.11+ on all platforms.

To install, just run:

```
$ pip install specialist
```

PEP 659: Specializing Adaptive Interpreter

Thank you!

@brandtbucher

Thank you!

@brandtbucher | brandt@python.org