



Unladen Swallow: Fewer coconuts, faster Python

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Why is Google doing this?

- Lots of Python at Google.
 - Python one of Google's three primary languages.
 - Python enables fast development, rapid prototyping.
 - Engineers should use the language they want...
 - ...and it should be fast.
- Biggest user: YouTube
 - YouTube is pure-Python.
 - #2 search site on the Internet, behind google.com.



Original Goals

- Make Python 5x faster.
- Source-compatible with existing Python code.
- Source-compatible with existing C extension modules.
- Focus on ease of migration.
- Open-source everything, merge back into CPython.



Why is Python slow?

```
def add(a, b):  
    return a + b
```

- Everything is an object.
- Everything is a method call, eventually.
- Ducktyping means we can't predict receiver types.





Sunday, February 21, 2010

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```
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>>> len(x)
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Why is Python slow?



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- Very late-binding
- Can't even make assumptions about builtin functions, types
- Very hard to predict, have to measure

Why is Python slow?

```
def foo(x):  
    yield len(x)  
    yield len(x)
```

```
>>> g = foo(range(5))  
>>> g.next()  
5  
>>> len = lambda y: 8  
>>> g.next()
```



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Unladen Swallow



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Prior work:

- Rubinius (Ruby)
- V8 (Chrome), TraceMonkey (Firefox), SquirrelFish Extreme (Safari)
- Pysco, PyPy
- HotSpot JVM, StrongTalk
- Self 93
- SmallTalk

Unladen Swallow

- Compile to machine code.



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 - ...

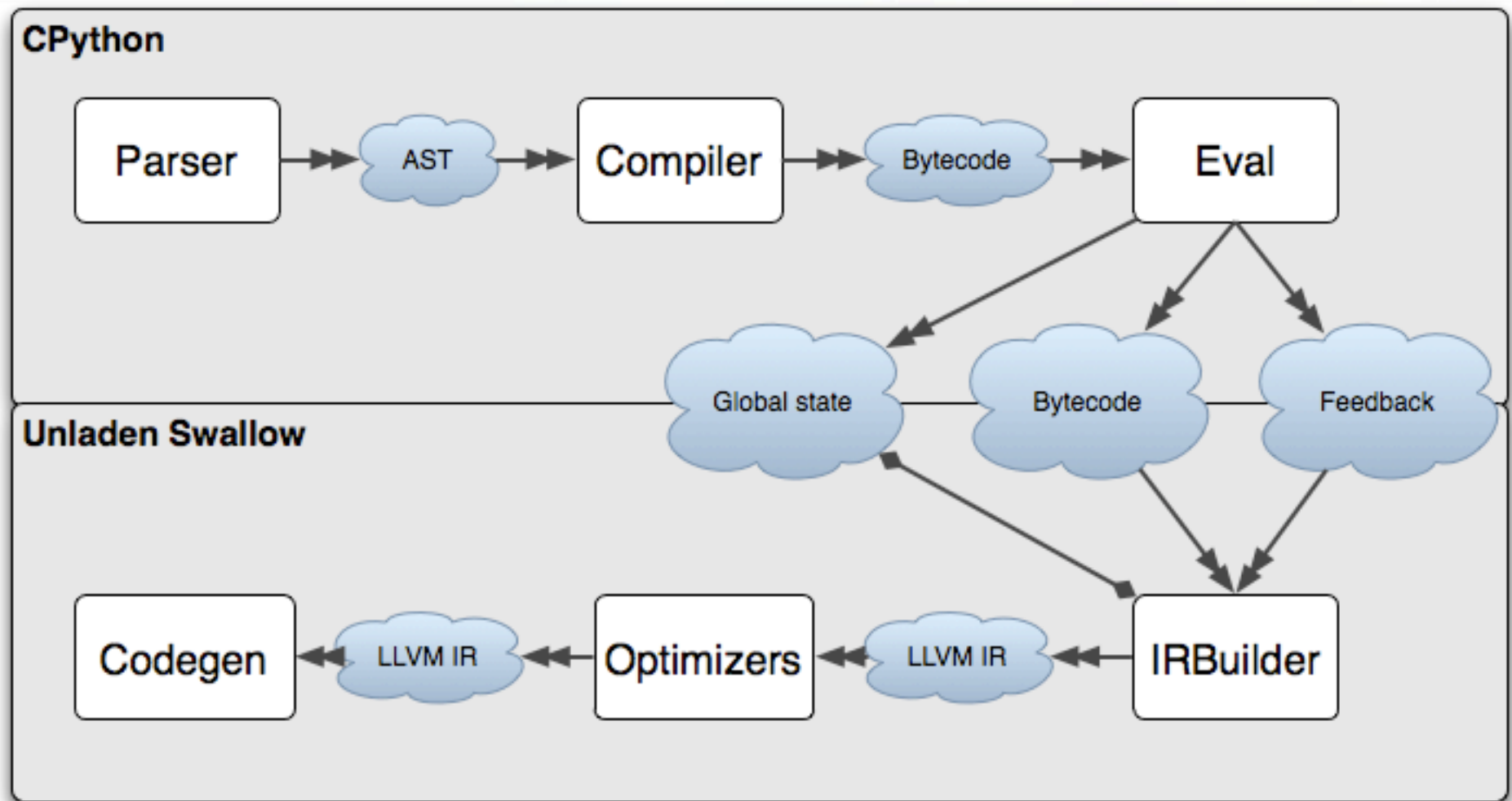


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- Bytecode compiler based on IRBuilder
- Clang used to compile parts of the runtime to IR for inlining

Make it faster: specialize dynamically

```
def escape(value):  
    from django.utils.safestring import mark_for_escaping  
    return mark_for_escaping(value)
```



0	LOAD_CONST	1	(-1)
3	LOAD_CONST	2	(('mark_for_escaping',))
6	IMPORT_NAME	0	(django.utils.safestring)
9	IMPORT_FROM	1	(mark_for_escaping)
12	STORE_FAST	1	(mark_for_escaping)
15	POP_TOP		
16	LOAD_FAST	1	(mark_for_escaping)
19	LOAD_FAST	0	(value)
22	CALL_FUNCTION	1	
25	RETURN_VALUE		



Make it faster: specialize dynamically

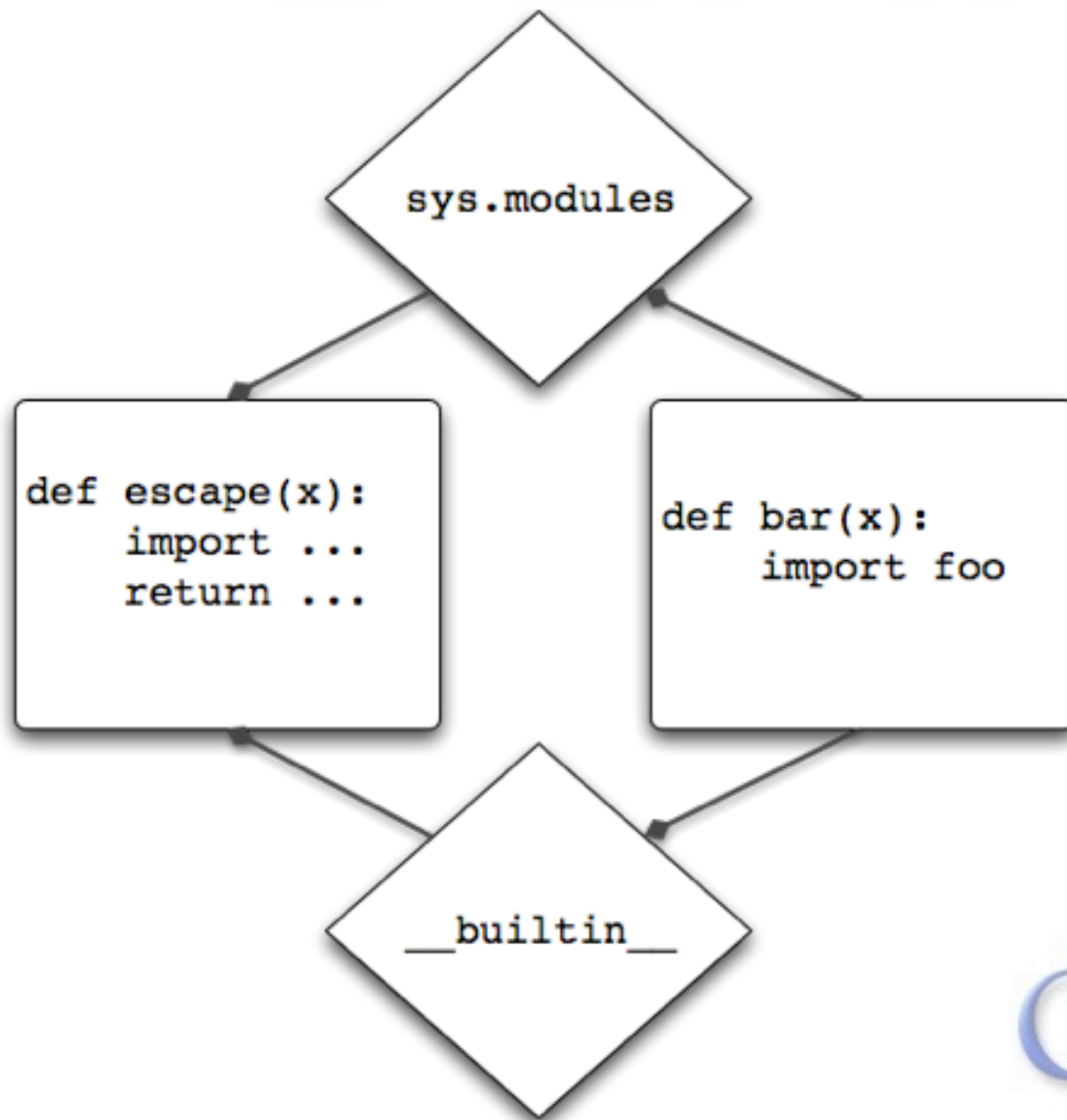
```
6  IMPORT_NAME                                0  (django.utils.safestring)
```



```
if (world_has_not_changed) {  
    x = (PyObject *)11712432  
}  
else {  
    goto bail_to_interpreter  
}
```



Make it faster: `if (world_has_not_changed) {`



Make it faster: specialize dynamically

```
def template(data, rows):  
    for row in rows:  
        data.append("<tr>")  
        for col in row:  
            data.append("<td>%s</td>" % col)  
        data.append("</tr>")
```

```
>>> our_data = []  
>>> template(our_data, our_rows)  
>>> print "".join(our_data)
```



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Highlights:

- data.append() lookups can be optimized to direct calls
- guard on type version
- "%s" % operator can be specialized

Zoom keys:

Apple option plus

Make it faster: call sites

```
data.append("<td>%s</td>" % col)
```



LOAD_FAST	0 (data)
LOAD_ATTR	0 (append)
LOAD_CONST	1 ('<td>%s</td>')
LOAD_FAST	1 (col)
BINARY_MODULO	
CALL_FUNCTION	1



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Make it faster: call sites

LOAD_FAST	0 (data)
LOAD_ATTR	0 (append)
...	
CALL_FUNCTION	1



```
data = locals[0];  
if (Py_TYPE_VERSION(data) != EXPECTED_TYPE)  
    goto bail_to_interpreter;  
// LOAD_CONST  
// LOAD_FAST  
// BINARY_MODULO  
retval = list_append(data, modulo_result);
```



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Top-down Inlining Opportunities

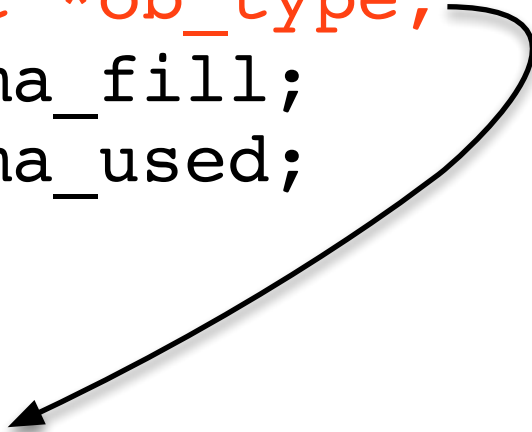
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>>> len(x)
```

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...which is NULL, so call PyMapping_Size()
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...which is a function pointer to dict_length()
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Python Objects: constant(ish)

```
struct PyDictObject {  
    Py_ssize_t ob_refcnt;  
    PyObject *ob_type;  
    Py_ssize_t ma_fill;  
    Py_ssize_t ma_used;  
    ...  
};  
  
PyObject PyDict_Type = {  
    ...  
    &dict_as_sequence,  
    &dict_as_mapping,  
    ...  
};
```



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- Mirror locals[2] to LLVM IR by walking a pointer tree
- Use a custom AA pass to mark most of the object as constant.
- Constant propagation will remove the second test.

Top-down Inlining: len()

```
static PyObject *
builtin_len(PyObject *self, PyObject *o)
{
    Py_ssize_t res;
    {
        PySequenceMethods *m;
        if (o == NULL) {
            // Error
        }
        m = o->ob_type->tp_as_sequence;
        if (m && m->sq_length)
            res = m->sq_length(o);
        else {
            PyMappingMethods *m;
            if (o == NULL) {
                // Error
            } else {
                m = o->ob_type->tp_as_mapping;
                if (m && m->mp_length)
                    res = m->mp_length(o);
                else
                    // Error
            }
        }
    }
    if (res < 0 && PyErr_Occurred())
        return NULL;
    return PyInt_FromSsize_t(res);
}
```



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Top-down Inlining: result

```
static PyObject *
builtin_len(PyObject *self, PyObject *v)
{
    return PyInt_FromSsize_t(((PyDictObject *)v)->ma_used);
}
```



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- Mirror locals[2] to LLVM IR by walking a pointer tree
- Use a custom AA pass to mark most of the object as constant.
- Constant propagation will remove the second test.

Measurement & Testing

- Benchmarks:
 - 32 benchmarks (and counting)!
 - YouTube hotspots: Spitfire templates, pickling.
 - Libraries: pickling, regexes, html5lib.
 - Apps: 2to3, Django, Rietveld, SpamBayes, etc.
 - Microbenchmarks: GC, IO, string operations.
 - Now in use by PyPy, soon by Jython.
- Correctness:
 - SWIGed code, extensions used by YouTube.
 - Google's large Python codebase.
 - Large Python projects: Django, NumPy, Twisted, etc.
 - Randomized testing.



Performance vs CPython 2.6.4

Benchmark	CPython	Unladen	Change
2to3	25.13 s	24.87 s	1.01x faster
django	1.08 s	0.68 s	1.59x faster
html5lib	14.29 s	13.20 s	1.08x faster
nbody	0.51 s	0.28 s	1.84x faster
rietveld	0.75 s	0.55 s	1.37x faster
slowpickle	0.75 s	0.55 s	1.37x faster
slowspitfire	0.83 s	0.61 s	1.36x faster
slowunpickle	0.33 s	0.26 s	1.26x faster
spambayes	0.31 s	0.34 s	1.10x slower



Performance vs Jython 2.5.1

Benchmark	Jython	Unladen	Change
ai	1.58	0.52	3.07x faster
django	2.0	0.8	2.48x faster
float	0.33	0.07	3.49x faster
rietveld	2.45	0.59	4.17x faster
slowpickle	0.86	0.56	1.54x faster
slowspitfire	2.76	0.63	4.39x faster
slowunpickle	0.38	0.27	1.37x faster



Performance vs PyPy

Benchmark	PyPy	Unladen	Change
ai	0.61	0.51	1.1921x faster
django	0.67	0.68	1.0136x slower
float	0.03	0.07	2.7108x slower
html5lib	20.04	16.42	1.2201x faster
pickle	17.70	1.09	16.2465x faster
rietveld	1.09	0.59	1.8597x faster
slowpickle	0.43	0.56	1.2956x slower
slowspitfire	2.50	0.63	3.9853x faster
slowunpickle	0.26	0.27	1.0585x slower
unpickle	28.45	0.78	36.6427x faster



Memory Usage vs CPython 2.6.4

Benchmark	CPython	Unladen	Change
2to3	26396 kb	46896 kb	1.77x
django	10028 kb	27740 kb	2.76x
html5lib	150028 kb	173924 kb	1.15x
nbody	3020 kb	16036 kb	5.31x
rietveld	15008 kb	46400 kb	3.09x
slowpickle	4608 kb	16656 kb	3.61x
slowspitfire	85776 kb	97620 kb	1.13x
slowunpickle	3448 kb	13744 kb	3.98x
spambayes	7352 kb	46480 kb	6.32x





Looking Back



Sunday, February 21, 2010

- Q1 release
- Tool detours: gdb, oProfile
- LLVM problems
- What we did right: code reuse,



GIL?



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Merger



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- PEP is out for review
- Review going well
- Good feedback from community:
 - Prioritize -j never performance
 - Shared linking for LLVM
 - No C++ at all under --without-llvm build

Fin

Questions?

<http://code.google.com/p/unladen-swallow/>

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#unladenswallow on OFTC

