THE JOY OF XEX

Revised & Updated for the 21st Century

Lazy Man's Cython Have Your Cake and Eat It Too Dan Gindikin and Peter Yianilos 6/13/2008



What Is Pex?

Preprocessor and build system for Cython



What We Wanted

A language that gets down to the iron, runs at C speeds, and has no surprises in generated assembly, but at the same time guides you along to a clear, succinct and correct expression of complicated systems and algorithms.





1. Ineffable quality



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 - write complicated algorithm



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- 1. Ineffable quality
 - write complicated algorithm
 - either it is right the first time
 - or it is very close, and easy to diagnose and fix
- 2. Look at program assembly execution trace
 - most instructions have to do with essence of problem





Stay easy, friendly, interpreter-like



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- Yet use all the cycles the computer has to offer to solve the problem, not for overhead



- Stay easy, friendly, interpreter-like
- Yet use all the cycles the computer has to offer to solve the problem, not for overhead
- Feel this has not been addressed, and not for any good technical reason



Discarded Candidates



Discarded Candidates

No C, didn't feel right in the 21st century



Discarded Candidates

- No C, didn't feel right in the 21st century
- No C++, didn't think we were smart enough.





Python, gets you everything except performance



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 - huge deal, wasn't clear there could be a language that would corral you in the right direction



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- Pyrex, epsilon away, most of the heavy lifting done



- Python, gets you everything except performance
 - huge deal, wasn't clear there could be a language that would corral you in the right direction
- Pyrex, epsilon away, most of the heavy lifting done
 - fast attribute access, exception handling, resource management - all the essentials for large system





No gear shifting to C



- No gear shifting to C
- Stay Pythonic, see how far you can push it without sacrificing performance



- No gear shifting to C
- Stay Pythonic, see how far you can push it without sacrificing performance
- Naturally leads to a few desirables





Already have linear algebra packages, but...



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- If Python API, Python overhead makes using small matrices infeasible



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- If Python API, Python overhead makes using small matrices infeasible
- May not have what you want
- Limits and contorts your thinking
 - you jump through hoops to vectorize
 - a priori, you only consider things that are vectorizable



Fast Numerics Basic



Fast Numerics Basic

```
In Pyrex

cdef int i

arr=numpy.zeros(n)

for i from 0<=i<n:
```

```
arr[i] = i
```



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C speed, as if arr is int*



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In Pex

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 $arr{i} = i$

C speed, as if arr is int*

Easily >100x faster



Matrix Multiply Pyrex

```
cdef void matmult(ndarray r,
       ndarray A, ndarray B):
     cdef int i,j,k
     for i from 0 \le i \le A.dimensions[0]:
       for j from 0 \le i \le B.dimensions[1]:
           for k from 0<=k<A.dimensions[1]:
              r[i,j]=r[i,j]+A[i,k]*B[k,j]
```



Matrix Multiply Pex

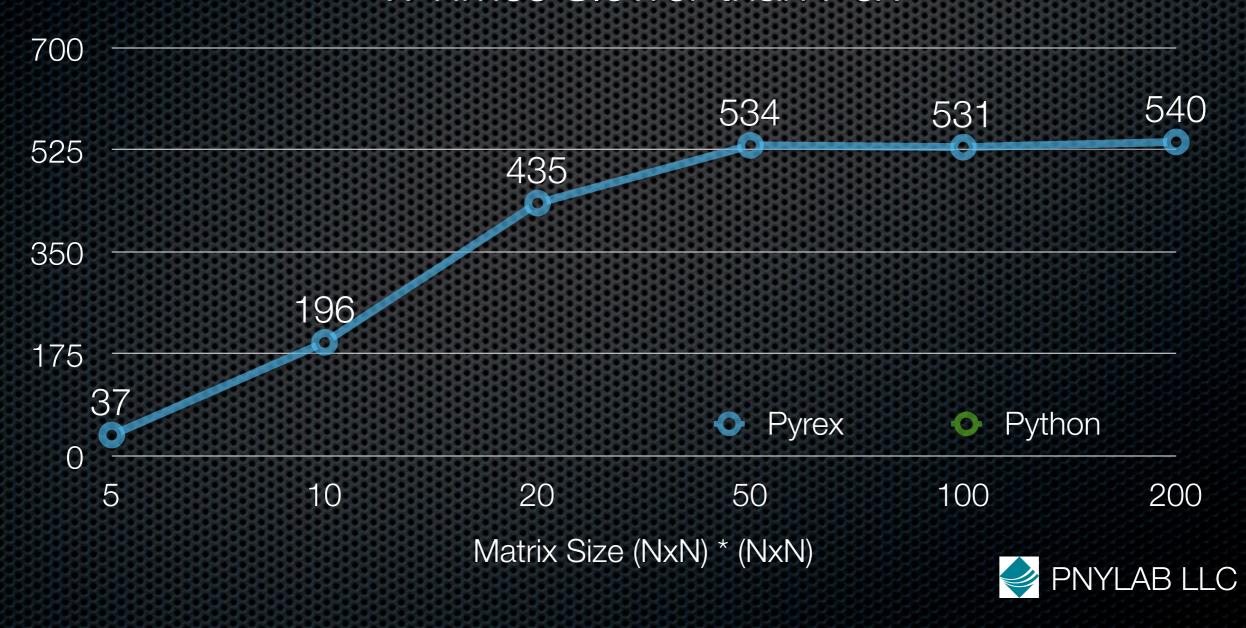
```
cdef void matmult(ndarray<double 2d> r,
       ndarray<double 2d> A, ndarray<double 2d> B):
     cdef int i,j,k
     for i from 0 \le i \le A.dimensions[0]:
       for j from 0 \le i \le B.dimensions[1]:
          for k from 0<=k<A.dimensions[1]:
              r\{i,i\}=r\{i,i\}+A\{i,k\}*B\{k,i\}
```



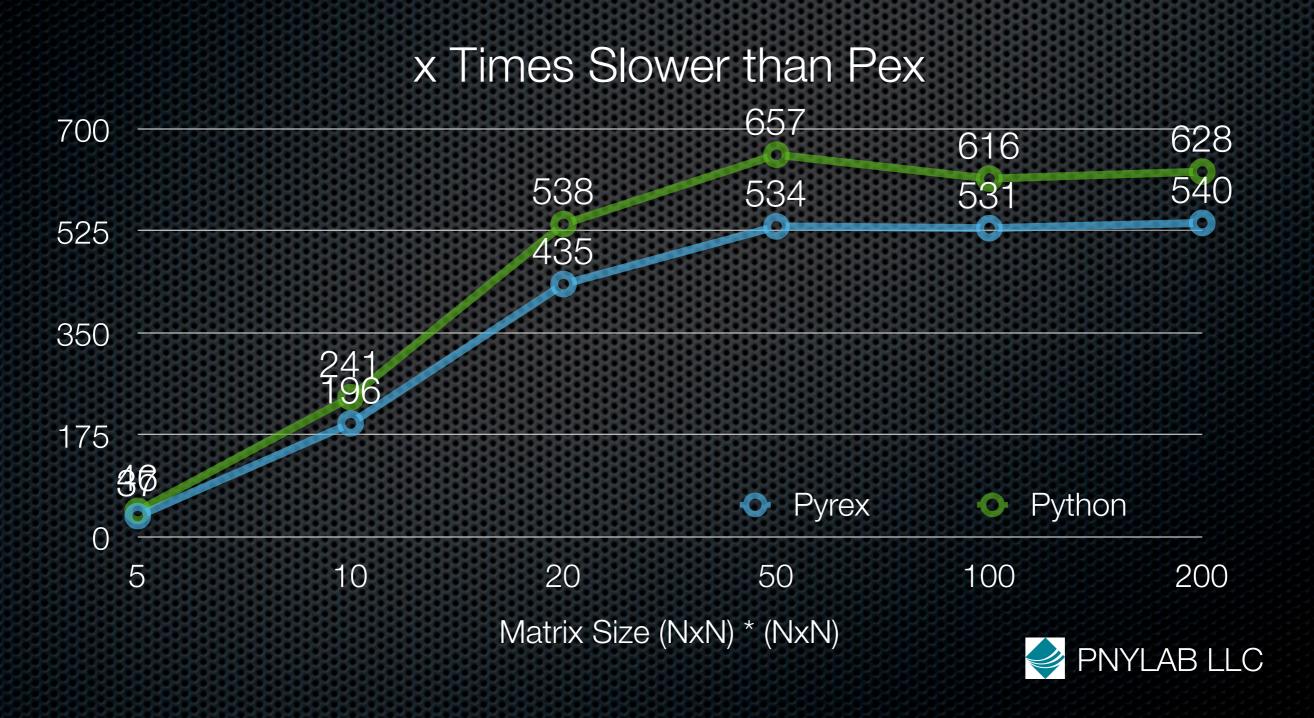
Matrix Multiply Performance



Matrix Multiply Performance



Matrix Multiply Performance



The Gauss-Jordan Sweep

$$H = SWP[k]G$$

$$h_{kk} = -1/g_{kk}$$
 $h_{jk} = h_{kj} = g_{jk}/g_{kk}, \quad j \neq k$
 $h_{jl} = h_{lj} = g_{jl} - g_{jk}g_{kl}/g_{kk}, \quad j \neq k \text{ and } l \neq k$

$$SWP[1, 2, ..., p]G = \begin{bmatrix} -G_{11}^{-1} & G_{11}^{-1}G_{12} \\ G_{21}G_{11}^{-1} & G_{22} - G_{21}G_{11}^{-1}G_{12} \end{bmatrix}.$$

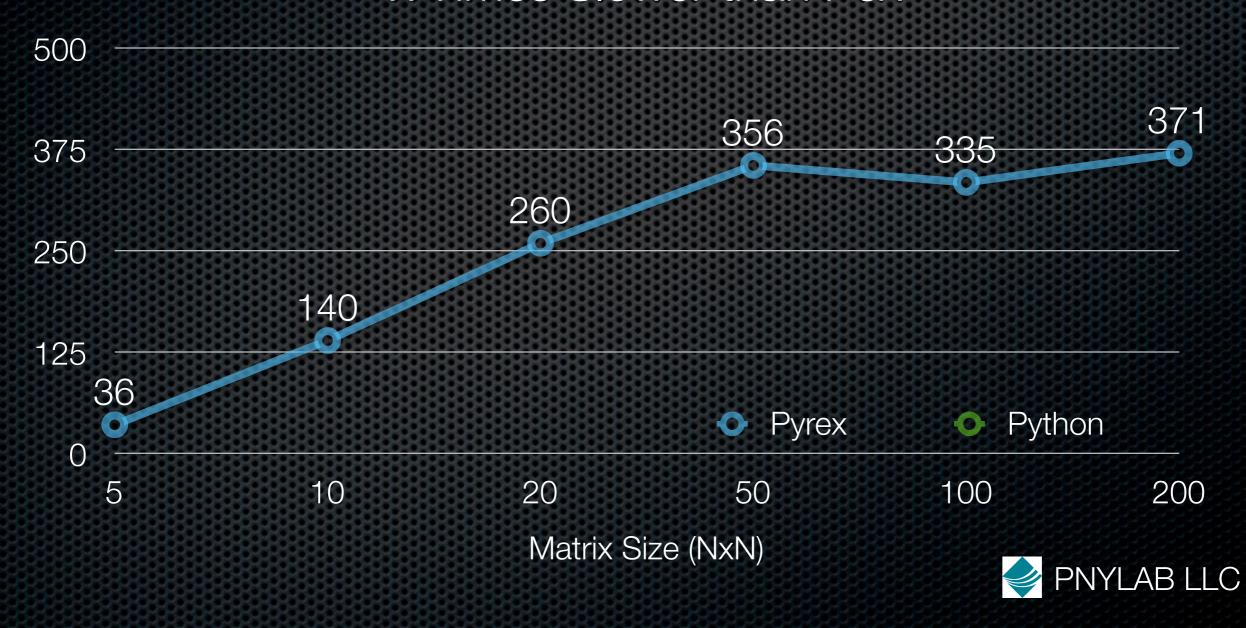


```
import numpy
                                                       import numpy
def sweep(x):
                                                       def sweep(ndarray<double 2d> x):
     n = x.shape[0]
                                                            cdef int
                                                                        n, 1, u, i, j, k
                                                            cdef double pivot_product
                                                           n = x.dimensions[0]
     1 = 0
                                                           1 = 0
     u = n-1
                                                            u = n-1
                                                            cdef ndarray<double,n> g_k
     g_k=numpy.zeros(n,'double')
     pivot_product = 1.0
                                                           pivot_product = 1.0
                                                           for k from 1 <= k <= u:
     for k in range(1,u+1):
         if x[k,k] == 0.0:
                                                                if x\{k,k\} == 0.0:
             pivot_product = 0.0
                                                                    pivot_product = 0.0
              break
                                                                    break
         pivot_product *= x[k,k]
                                                                pivot_product *= x(k,k)
         x[k,k] = -1.0 / x[k,k]
                                                                x(k,k) = -1.0 / x(k,k)
                                                                for j from 0 \ll j \ll n:
         for j in range(n):
              if j == k:
                                                                    if j == k:
                  continue
                                                                        continue
             g_k[j] = x[j,k]
                                                                    g_k\{j\} = x\{j,k\}
                                                                    x(j,k) = x(k,j) = -x(k,k) * g_k(j)
             x[j,k] = x[k,j] = -x[k,k] * g_k[j]
                                                                for i from 0 \le i \le n:
         for i in range(n):
              if i == k:
                                                                    if i == k:
                  continue
                                                                        continue
                                                                    for j from 0 <= j <= i:
             for j in range(i+1):
                                                                        if j == k:
                  if j == k:
                      continue
                                                                            continue
                  x[j,i] = g_k[i] * x[k,j]
                                                                        x(j,i) = g_k(i) * x(k,j)
                 x[i,j] = x[j,i]
                                                                        x\{i,j\} = x\{j,i\}
     return pivot_product
                                                            return pivot_product
```

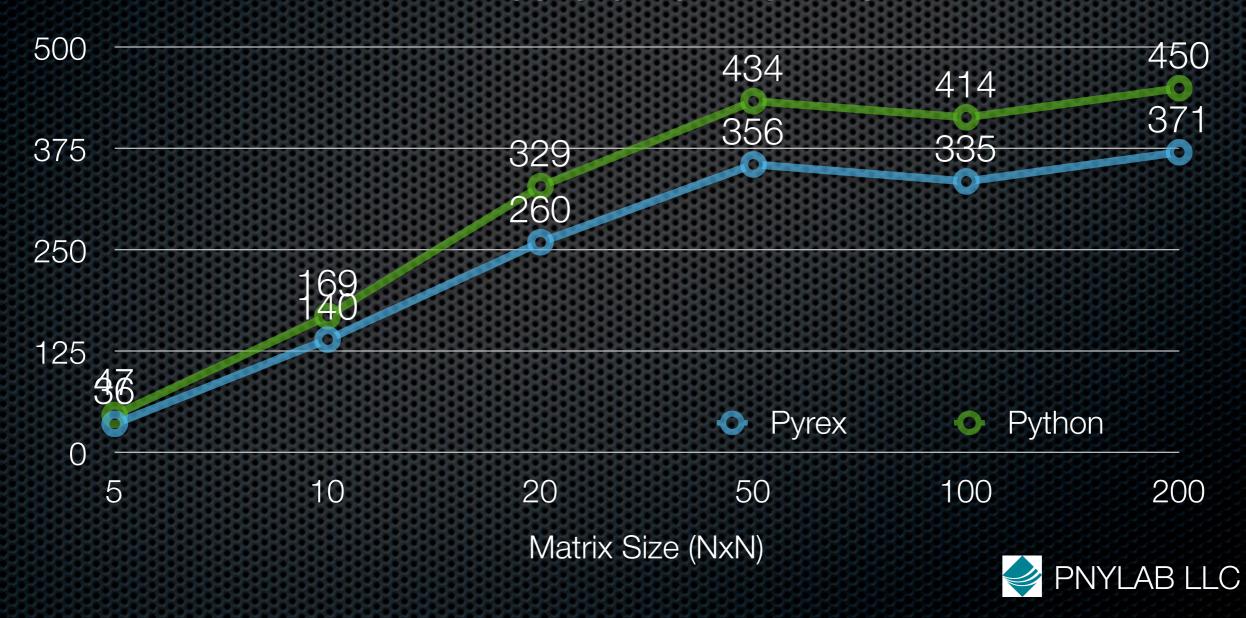
Sweep Algorithm Performance



Sweep Algorithm Performance



Sweep Algorithm Performance





You write file.px

cdef class item:

cdef double x,y,z

cdef meth(me): pass

cdef func():pass



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Pex produces file.pxd

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cdef func()



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Pex produces file.pxd

cdef class item:

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cdef meth(me)

cdef func()

And file.pyx

<... implementation ...>





main.px

%pimport mod



main.px

%pimport mod

mod.px

%pimport submod



main.px

%pimport mod

mod.px

%pimport submod

submod.px

pass



main.px

%pimport mod

mod.px

%pimport submod

submod.px

pass

In the shell

\$ pex main.px



main.px

%pimport mod

mod.px

%pimport submod

submod.px

pass

In the shell

\$ pex main.px

Or in Python

main=pex.pimport('main')



main.px

%pimport mod

mod.px

%pimport submod

submod.px

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In the shell

\$ pex main.px

Or in Python

main=pex.pimport('main')

 submod gets compiled, then mod, then main



main.px

%pimport mod

mod.px

%pimport submod

submod.px

pass

In the shell

\$ pex main.px

Or in Python

main=pex.pimport('main')

- submod gets compiled, then mod, then main
- Feels interpreted



Automatically pickleable cdef classes



Automatically pickleable cdef classes

- They are!
- Pex generates the magic <u>reduce</u> and <u>setstate</u>
 methods
- Caveat: can not have C pointer or struct attributes



Discovered We Wanted More



Fast Slices



Fast Slices

```
cdef ndarray<double,(n,m,k)> arr
```

```
arr{:,1:7,:-4}
```



Fast Slices

```
cdef ndarray<double,(n,m,k)> arr
arr{:,1:7,:-4}
same as
arr[:,1:7,:-4]
```

but does not plumb through python runtime, just quick creation of an ndarray header (in C code)





Pickling



```
Pickling

write

cdef class item: pass

pickle.dump(item(),open('file','w'))
```



```
Pickling

write

cdef class item: pass

pickle.dump(item(),open('file','w'))

read

x = pickle.load(open('file'))
```



Faster Serialization

```
Pickling
  write
    cdef class item: pass
    pickle.dump(item(),open('file','w'))
  read
    x = pickle.load(open('file'))
Goes through Python, slow
```





```
write
  cdef item x = item()
  x._fastdump_(open('file','w'))
```



```
write
  cdef item x = item()
  x._fastdump_(open('file','w'))
read
  x = pex_create_uninitialized(item)
  x._fastload_(open('file'))
```



```
write
  cdef item x = item()
  x._fastdump_(open('file','w'))
read
  x = pex_create_uninitialized(item)
  x._fastload_(open('file'))
```

>12x faster than pickling, as fast as writing a C struct





Can't dump a Python list



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- Can't dump an ndarray of Python object



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- All attributes must be either primitive C types (int, double, etc), or decorated ndarrays



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- Can't dump a Python list
- Can't dump an ndarray of Python object
- All attributes must be either primitive C types (int, double, etc), or decorated ndarrays
- This is just for the leafs of your object hierarchy
- Still, can read/write mammoth data at C speed



Less Vigorous Coredump (1)



Less Vigorous Coredump (1)

```
Have main.px

cdef poof():

cdef int *p=NULL

p[0]

def func(): poof()

def main(): func()
```



Less Vigorous Coredump (1)

```
Have main.px
```

```
cdef poof():
```

```
cdef int *p=NULL
```

p[0]

def func(): poof()

def main(): func()

Guess what happens

\$ pex main.px



Less Vigorous Coredump (2)

\$ pex main.px

```
---- BEG BACKTRACE -----
   Containing Executable File
                                                                      Closest Symbol
                                       Instruction Addr
                                                                   pyx pf 201 func
   ./main.so
                                      0x3ACA
  /usr/lib/libpython2.3.so.1.0
                                      0 \times 43991
                                                                   PyCFunction Call
  /usr/lib/libpython2.3.so.1.0
                                      0x20637
                                                                       PyObject Call
  /usr/lib/libpython2.3.so.1.0
                                                     PyEval CallObjectWithKeywords
                                      0 \times 721B0
                                                                PyObject CallObject
   /usr/lib/libpython2.3.so.1.0
                                      0x205FE
   ./main.so
                                      0x37C3
                                                                  pyx pf 201 main
   /usr/lib/libpython2.3.so.1.0
                                      0x780A6
                                                                  PyEval EvalCodeEx
  /usr/lib/libpython2.3.so.1.0
                                      0 \times 7836D
                                                                     PyEval EvalCode
  /usr/lib/libpython2.3.so.1.0
                                      0 \times 92952
                                                            PyRun SimpleFileExFlags
  /usr/lib/libpython2.3.so.1.0
                                                               PyRun AnyFileExFlags
                                      0x939A4
                                      0 \times 9869 E
   /usr/lib/libpython2.3.so.1.0
                                                                             Py Main
                                      0x5B2
                                                                                main
  python
   /lib/tls/libc.so.6
                                      0x14DE3
                                                                  libc start main
                                      0 \times 501
                                                                               (null)
  python
                                                                             [START]
---- END BACKTRACE -----
```





```
file main.px
```

```
cdef ndarray<int,n> arr
```

```
arr{n+1}
```



```
file main.px

cdef ndarray<int,n> arr

arr{n+1}
```

run with bounds checking (about 20 times slower)



```
file main.px

cdef ndarray<int,n> arr

arr{n+1}

run with bounds checking (about 20 times slower)

$ pex -b main.px
```



```
file main.px

cdef ndarray<int,n> arr

arr{n+1}
```

run with bounds checking (about 20 times slower)

\$ pex -b main.px

```
Traceback (most recent call last):

File "main.pyx", line 298, in main.main

__px__ndarray_int_get1(arr,"arr",n+1,'n+1') ## arr{n+1} | main.px,4

IndexError: Out of bounds index access "n+1"==11 for dimension 1 of "arr" which has length 10
```



Compilation Configuration



Compilation Configuration

Setup link with external C libraries inside your file.px

%whencompiling:

env.cc.append('-l../../vector/include')

env.link.append('../../vector/vector.so')



Compilation Configuration

Setup link with external C libraries inside your file.px

%whencompiling:

env.cc.append('-l../../vector/include')

env.link.append('../../vector/vector.so')

Then bring in prototypes as usual

cdef extern from "vector.h": ...





def func(ndarray<int 2d> arr):



def func(ndarray<int 2d> arr):

%whencompiling:

scope.pragma_ndarray_bounds_checks = True



```
def func(ndarray<int 2d> arr):
    %whencompiling:
    scope.pragma_ndarray_bounds_checks = True
    arr{1,n+1} # THROWS EXCEPTION
```



```
def func(ndarray<int 2d> arr):
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Turns on bounds checks



```
def func(ndarray<int 2d> arr):
```

%whencompiling:

scope.pragma_ndarray_bounds_checks = True

arr{1,n+1} # THROWS EXCEPTION

Turns on bounds checks

Works by scope, so here pragma applies only to func()





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- Define in Pex, mod.px

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```
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```

```
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```

```
From Pythonmod=pex.pimport('mod')x = mod.item()
```



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- Pex generates _todict_ and _fromdict_ methods
- Define in Pex, mod.px

```
cdef class item:
```

```
cdef int x,y
```

```
    From Python
    mod=pex.pimport('mod')
    x = mod.item()
    x._fromdict_({'x':7,'y':12})
```



- cdef classes opaque to Python
- Pex generates _todict_ and _fromdict_ methods
- Define in Pex, mod.pxcdef class item:

```
cdef int x,y
```

```
From Python
mod=pex.pimport('mod')
x = mod.item()
x._fromdict_({'x':7,'y':12})
print x._todict_()
out: {'y': 12, 'x': 7}
```





Pex has no parser, regular expression based



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- Leads to annoying quirks, eg

```
def func(a, # comment b):
```



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- Pex has no parser, regular expression based
- Leads to annoying quirks, eg

```
def func(a, # comment b):
```

- Joined to def func(a, # comment b):, so syntax error
- Also, no real type system



Off the Reservation



Off the Reservation

- pointers (tool of the devil)
 - don't use them
 - don't think you need to
 - would like to prohibit them
- structs (use cdef classes instead)





Luxuriate in Python decadence



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 - lists, tuples, dicts, itertools, anything goes



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 - most of the time
- Get down to the iron where it matters



- Luxuriate in Python decadence
 - lists, tuples, dicts, itertools, anything goes
 - most of the time
- Get down to the iron where it matters
 - not much additional pain, lots of performance





Have enough performance



- Have enough performance
 - INCREFd memory management fast, good



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 - INCREFd memory management fast, good
- Compiler working hard not only OK, but what you want



- Have enough performance
 - INCREFd memory management fast, good
- Compiler working hard not only OK, but what you want
- With this setup, someone who only knows Python, can write C efficient code





Coredumps change feel of language



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 - completely



- Coredumps change feel of language
 - completely
 - sleep worse



- Coredumps change feel of language
 - completely
 - sleep worse
 - waste life chasing down horrific memory bugs



- Coredumps change feel of language
 - completely
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 - die younger



- Coredumps change feel of language
 - completely
 - sleep worse
 - waste life chasing down horrific memory bugs
 - die younger
 - taken away from essence of problem





Control coredumps



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- Give up pointers, naked memory access (Hello Fortran!)



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- Control coredumps
- Give up pointers, naked memory access (Hello Fortran!)
 - not as horrible as it sounds
 - have fast arrays, add in fast multiple value return
 - the only thing you give up: blitting
 - allows safe mode guaranteed to catch corruption





Runs within 3-4x times slower



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- Guaranteed to catch any memory corruption



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- Set a mask at compile time



Going Forward Safe Mode

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 - bounds checking



Going Forward Safe Mode

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 - bounds checking
 - uninitialized variable access



Going Forward Safe Mode

- Runs within 3-4x times slower
- Guaranteed to catch any memory corruption
- Set a mask at compile time
 - bounds checking
 - uninitialized variable access
 - keeps track of object creation, detects leaked cycles





Pragma C_code_only



- Pragma C_code_only
- Fast operator overloading



- Pragma C_code_only
- Fast operator overloading
- Fast multiple return



- Pragma C_code_only
- Fast operator overloading
- Fast multiple return
- Fast comprehensions: arr={i*i for i from 0<=i<n if i%2}



- Pragma C_code_only
- Fast operator overloading
- Fast multiple return
- Fast comprehensions: arr={i*i for i from 0<=i<n if i%2}
- Tool color codes source based on whether it's C or Py



Now Want



Now Want

cdef ndarray<int,(3,4)> arr cdef int arr{3,4}



Now	Want
cdef ndarray <int,(3,4)> arr</int,(3,4)>	cdef int arr{3,4}
cdef item x=item(arg1,arg2)	cdef item x(arg1, arg2)



Now	Want
cdef ndarray <int,(3,4)> arr</int,(3,4)>	cdef int arr{3,4}
cdef item x=item(arg1,arg2)	cdef item x(arg1, arg2)

And also want, efficient append to 1d ndarray





• 30 KLOC of Pex code (1.4 MLOC generated C)



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- 5 people actively using Pex, more soon



- 30 KLOC of Pex code (1.4 MLOC generated C)
- 5 people actively using Pex, more soon
- Business unforgiving, speed and quality essential



Status Availability

- Python Software Foundation License (PSF)
- Works on Unix, Mac (all but coredump backtraces),
 Windows probably close, but who knows
- Get
 - pexlang.sourceforge.net



Status Immediate Future

- Want to stop heavy development for a year or so
- Happy to help move any features into Cython proper
- Happy to accept any patches



Conclusion

Initial goal

A language that gets down to the iron, runs at C speeds, and has no surprises in generated assembly, but at the same time guides you along to a clear, succinct and correct expression of complicated systems and algorithms.

 We feel we are there, and are prepared to live with rough edges for awhile



Implementation Details Fast Numerics

cdef ndarray<int 2d> A

int *data = A.data

int st0,st1

st0 = A.strides[0]/sizeof(int)

st1 = A.strides[1]/sizeof(int)

arr{i,j}

data[st0 * i + st1 * j]





```
Root.px
A.px B.px
AA.px AB.px
ABA.px
ABA.px
```



```
Root.px
A.px B.px
AA.px AB.px
ABA.px
ABA.px
```

In Python could say

Root.A.AB.ABA.func



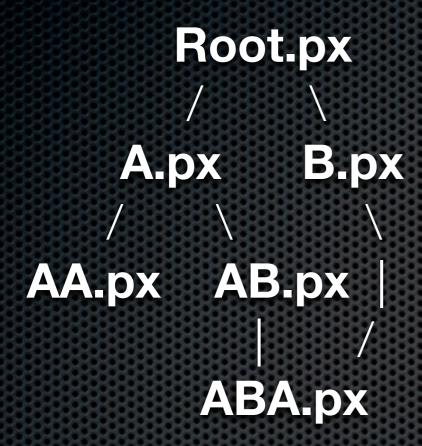
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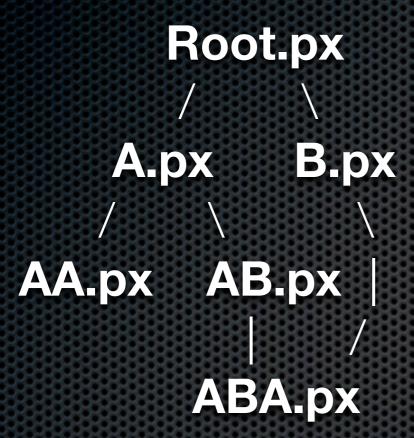
In Python could say

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In Pyrex, same thing!

func could be cdef





In Python could say

Root.A.AB.ABA.func

In Pyrex, same thing!

func could be cdef

Root must know all prototypes of ABA at compile time





```
Root.px
A.px B.px
AA.px AB.px
ABA.px*
```



```
Root.px
A.px B.px
AA.px AB.px

ABA.px*
```

If **ABA** changes

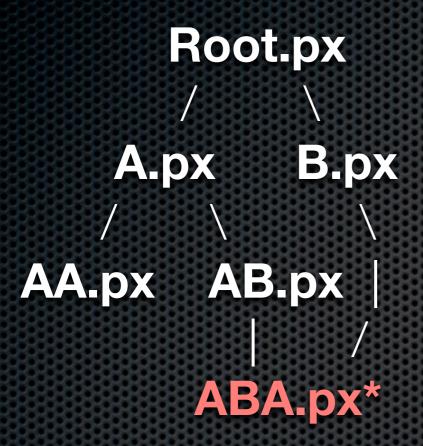


```
Root.px
A.px B.px
AA.px AB.px
ABA.px*
```

If **ABA** changes

need **Root** recompile



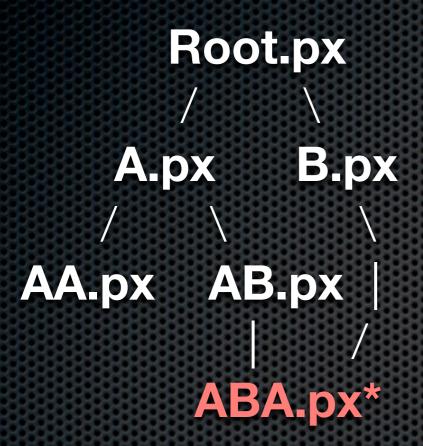


If **ABA** changes

need Root recompile

must detect this before **Root** is imported, else it is too late





If **ABA** changes

need Root recompile

must detect this before **Root** is imported, else it is too late

Must walk import tree in preorder

