

Advanced Topics in Python

Siavash Mirarab

What we will do

- Represent alignment using simple python constructs
- Make simple methods that do interesting stuff on the alignment
- Run external programs on the alignment
- Profile the program to find out about performance

We will learn about

- Object-oriented programming and Classes
- Python built-in function
 - all, any, map, reduce, sorted, zip, etc.
- Generators and lambda
- Calling external programs using Popen
- A bit about timeit
- A bit about Dendropy
- A bit about regex

FASTA Sequences/Alignments

>Human

AACGTGATACTAACGACA-

>Chimp

AA-GTGCTA-CTAACGACAC

>Gorilla

GACGTGAAA-CACTCGACAC

- Represent the alignment as a **dictionary!**
- Do stuff using the alignment

Class, Object, Instance, blah blah

- Object-oriented programming:
 - Put cohesive pieces of code together in units called Classes
 - A Class has a set of related data variables and a set of functions that operate on those variables
 - Multiple “instances” of each class can be constructed. These will each have their own data variables.
 - Goal: encapsulate data and functionality together
- Classes are like types (string, int, etc.) and objects are like variables you built from those types(3,6 of type int, “DNA” of type str)

An Alignment Class

```
class Alignment(object):
    ''' This class represents an alignment '''

    def __init__(self):
        ''' Constructor '''
        pass
```

Let's put the code above in a module called alignment.py

Using a dict to keep alignments

```
class Alignment(object):
    ''' This class represents an alignment '''

    def __init__(self):
        ''' Constructor '''
        self.sequences = dict()
```

```
from alignment import Alignment
a1 = Alignment()
a2 = Alignment()
a1.sequences["Human"] = "ACGT"
a2.sequences["Human"] = "TGCA"
print a1.sequences["Human"], a2.sequences["Human"]
ACGT TGCA
```

Adding Methods

```
class Alignment(object):
    ''' This class represents an alignment '''

    def __init__(self):
        ''' Constructor '''
        self.sequences = dict()

    def add_sequence(self, seq_name, seq):
        ''' Adds a sequence to the alignment.
        Overwrites old sequences with the same name '''
        self.sequences[seq_name] = seq

    def names(self):
        ''' return the list of names '''
        return self.sequences.keys()

    def sequence(self, k):
        ''' return the sequence for a given name '''
        return self.sequences[k]
```

How are methods used?

```
class Alignment(object):
    ''' This class represents an alignment '''

...
def add_sequence(self, seq_name, seq):
    ''' Adds a sequence to the alignment.
    Overwrites old sequences with the same name.'''
    self.sequences[seq_name] = seq
```

```
alignment = Alignment()
alignment.add_sequence("Human", "AACGTGATACCTA")
```

More useful functions

```
class Alignment(object):
    ...
    def read_fasta(self, filename):
        name = None
        seq = []
        for line in open(filename, 'rU'):
            if line.startswith(">"):
                if name:
                    self.add_sequence(name, ''.join(seq))
                seq = []
                name = line[1:].strip()
            else:
                seq.append(line.strip())
        self.add_sequence(name, ''.join(seq))
```

```
alignment.read_fasta("test.fasta")
```

Printing an alignment

```
class Alignment(object):
    ''' This class represents an alignment '''
    ...
    ...
    def write_fasta(self, dest):
        ''' Write alignment in fasta format to dest.
        sequences will be sorted. dest is a File Object.
        '''
        for name in sorted(self.sequences.keys()):
            dest.write('>%s\n%s\n' %
                      (name, self.sequences[name]))
```

```
import sys
alignment.write_fasta(sys.stdout)
with open("copy_of_test.fasta", 'w') as f:
    alignment.write_fasta(f)
```

Checking types

```
class Alignment(object):
    ''' This class represents an alignment '''
    ...
    ...
    def write_fasta(self, dest):
        ''' Write alignment in fasta format to dest.
            sequences will be sorted. dest is a File Object. '''
        f = open(dest, 'w') if isinstance(dest, str) else dest
        for name in sorted(self.sequences.keys()):
            f.write('>%s\n%s\n' %
                    (name, self.sequences[name]))
        if isinstance(dest, str):
            f.close()
```

```
alignment.write_fasta("another_copy.fasta")
```

Built-in functions: all, any

```
def is_aligned(self):
    if len(self.sequences) == 0:
        raise ValueError('empty alignment; full or empty?')
    l = len(self.sequences.values()[0])
    return all( [len(x) == l for
                x in self.sequences.values() ] )

def has_gaps(self, key):
    return any ( [x=="-" for x in self.sequences[key] ] )
```

```
print alignment.is_aligned()
print alignment.has_gaps("Human")
alignment.add_sequence("Fragment", "AAGTG")
print alignment.is_aligned()
print alignment.has_gaps("fragment")
```

Generators using () instead of []

```
def is_aligned(self):
    if len(self.sequences) == 0:
        raise ValueError('empty alignment; full or empty?')
    l = len(self.sequences.values()[0])
    return all( (len(x) == l for
                 x in self.sequences.values() ) )

def has_gaps(self, key):
    return any( (x=="-" for x in self.sequences[key] ) )
```

```
print alignment.is_aligned()
print alignment.has_gaps("Human")
alignment.add_sequence("Fragment", "AAGTG")
print alignment.is_aligned()
print alignment.has_gaps("fragment")
```

Built-in functions map, reduce & Generators

```
def sequences_without_gaps(self):
    ''' Generates sequences with all gaps removed.
    '''
    for seq in self.sequences.values():
        yield seq.replace("-", "")

def max_length(self):
    ''' returns maximum sequence length'''
    return reduce(max,
                 map(len, self.sequences_without_gaps()))
```

```
print alignment.max_length()
```

Built-in functions filter and zip & lambda

```
def hamming(self, k1, k2):
    s1=self.sequences[k1]
    s2=self.sequences[k2]
    l = float(max(len(s1),len(s2)))
    return sum(
        map( lambda x: 1 if x[0]==x[1] else 0,
            zip(s1,s2) ) ) / l

def similar_sequences(self, name, thrs):
    return filter( lambda x:
                    self.hamming(name, x) >= thrs,
                    self.sequences.keys() )
```

```
print alignment.hamming("Human", "Chimp") → 0.8
print alignment.hamming("Human", "Gorila") → 0.65
print alignment.similar_sequences("Human", 0.7)
['Chimp', 'Human']
```

Built-in functions

<http://docs.python.org/2/library/functions.html>

Built-in Functions				
<code>abs()</code>	<code>divmod()</code>	<code>input()</code>	<code>open()</code>	<code>staticmethod()</code>
<code>all()</code>	<code>enumerate()</code>	<code>int()</code>	<code>ord()</code>	<code>str()</code>
<code>any()</code>	<code>eval()</code>	<code>isinstance()</code>	<code>pow()</code>	<code>sum()</code>
<code>basestring()</code>	<code>execfile()</code>	<code>issubclass()</code>	<code>print()</code>	<code>super()</code>
<code>bin()</code>	<code>file()</code>	<code>iter()</code>	<code>property()</code>	<code>tuple()</code>
<code>bool()</code>	<code>filter()</code>	<code>len()</code>	<code>range()</code>	<code>type()</code>
<code>bytearray()</code>	<code>float()</code>	<code>list()</code>	<code>raw_input()</code>	<code>unichr()</code>
<code>callable()</code>	<code>format()</code>	<code>locals()</code>	<code>reduce()</code>	<code>unicode()</code>
<code>chr()</code>	<code>frozenset()</code>	<code>long()</code>	<code>reload()</code>	<code>vars()</code>
<code>classmethod()</code>	<code>getattr()</code>	<code>map()</code>	<code>repr()</code>	<code>xrange()</code>
<code>cmp()</code>	<code>globals()</code>	<code>max()</code>	<code>reversed()</code>	<code>zip()</code>
<code>compile()</code>	<code>hasattr()</code>	<code>memoryview()</code>	<code>round()</code>	<code>__import__()</code>
<code>complex()</code>	<code>hash()</code>	<code>min()</code>	<code>set()</code>	<code>apply()</code>
<code>delattr()</code>	<code>help()</code>	<code>next()</code>	<code>setattr()</code>	<code>buffer()</code>
<code>dict()</code>	<code>hex()</code>	<code>object()</code>	<code>slice()</code>	<code>coerce()</code>
<code>dir()</code>	<code>id()</code>	<code>oct()</code>	<code>sorted()</code>	<code>intern()</code>

Running external programs

- You can invoke other programs directly from python
- Many ways, some simple, some not so much
- Will look at the most “kosher” way: popen
- Scenario:
 - Read an alignment
 - Filter out short and distantly-related sequences
 - Run FastTree on it to get an alignment

Filtering function

```
from alignment import Alignment

def filter_alignment(alg, thrs, len_thrs):
    filtered = reduce(set.union,
                      (set(alg.similar_sequences(x, thrs)) - set([x])
                       for x in alg.names()))
    print "%d sequences after filtering by similarity" % len(filtered)

    filtered = filter(lambda x:
                      len(alg.sequence(x).replace("-", "")) > len_thrs,
                      filtered)
    print "%d sequences after filtering by length %d" % (len(filtered), len_thrs)

    filtered_alg = Alignment()
    for x in filtered:
        filtered_alg.add_sequence(x, alg.sequence(x))

    return filtered_alg
```

This is in a new module called filter_n_tree.py

subprocess.Popen

- Use this to call an external program (span new processes)
- Multiple options – simplest:
 - subprocess.call([command,arg1,arg2,...])
 - subprocess.check_call()
 - subprocess.check_output()
- Alternative: p=subprocess.Popen
 - p.communicate()
 - p.wait()

First attempt at running FastTree

```
import subprocess

in_alg_file = sys.argv[1]
similarity_threshold = int(sys.argv[2])/100.0
length_threshold = int(sys.argv[3])

alg = Alignment()
alg.read_fasta(in_alg_file)
print "%d sequences were found in alignment %s" \
    %(len(alg.names()), in_alg_file)

filtered_alg = filter_alignment \
    (alg,similarity_threshold, length_threshold)

assert filtered_alg.is_aligned(), "input file is not aligned"

filtered_alg_file = "%s.filtered" % in_alg_file
filtered_alg.write_fasta(filtered_alg_file)

subprocess.check_call( ["FastTree",
                      "-out", "%s.tree" % filtered_alg_file,
                      "-nt", "-gtr",
                      filtered_alg_file])
```

Run ...

33 sequences were found in alignment pythonidae.aln.fasta

23 sequences after filtering by similarity

19 sequences after filtering by length 1000

FastTree Version 2.1.7 SSE3

Alignment: pythonidae.aln.fasta.filtered

Nucleotide distances: Jukes-Cantor Joins: balanced Support: SH-like 1000

Search: Normal +NNI +SPR (2 rounds range 10) +ML-NNI opt-each=1

TopHits: 1.00*sqrtN close=default refresh=0.80

ML Model: Generalized Time-Reversible, CAT approximation with 20 rate categories

Non-unique name 'Antaresia' in the alignment

Traceback (most recent call last):

File "/Users/smirarab/workspace/IBCC/src/PipeLine.py", line 52, in <module>
 filtered_alg_file])

File "/System/Library/Frameworks/Python.framework/Versions/2.7/lib/python2.7/
subprocess.py", line 542, in check_call

 raise CalledProcessError(retcode, cmd)

subprocess.CalledProcessError: Command '['FastTree', '-out',
'pythonidae.aln.fasta.filtered.tree', '-nt', '-gtr', 'pythonidae.aln.fasta.filtered']' returned
non-zero exit status 1

Run ...

33 sequences were found in alg pythonidae.aln.fasta

23 sequences after filtering by similarity

19 sequences after filtering by length 1000

FastTree Version 2.1.7 SSE3

Alignment: pythonidae.aln.fasta.filtered

Nucleotide distances: Jukes-Cantor Joins: balanced Support: SH-like 1000

Search: Normal +NNI +SPR (2 rounds range 10) +ML-NNI opt-each=1

TopHits: 1.00*sqrtN close=default refresh=0.80

ML Model: Generalized Time-Reversible, CAT approximation with 20 rate categories

...

ML-NNI round 2: LogLk = -13870.760 NNIs 1 max delta 5.26 Time 1.09

1.08 seconds: ML NNI round 3 of 8, 1 of 17 splits

ML-NNI round 3: LogLk = -13870.715 NNIs 0 max delta 0.00 Time 1.13

Turning off heuristics for final round of ML NNIs (converged)

ML-NNI round 4: LogLk = -13870.075 NNIs 0 max delta 0.00 Time 1.29 (final)

1.28 seconds: ML Lengths 1 of 17 splits

Optimize all lengths: LogLk = -13870.074 Time 1.33

Total time: 1.56 seconds Unique: 19/19 Bad splits: 0/16

Safe names

```
def safe_name(self, name):
    return name.replace(" ", "_")

def write_fasta(self, dest, safe_names=False):
    ''' Write alignment in fasta format to dest.
    sequences will be sorted.'''
    f = open(dest, 'w') if isinstance(dest, str) else dest
    for name in sorted(self.sequences.keys()):
        f.write('>%s\n%s\n' %
                (self._safe_name(name) if safe_names else name,
                 self.sequences[name]))
    if isinstance(dest, str):
        f.close()

filtered_alg.write_fasta(filtered_alg_file, safe_names = True)
```

Practice

- Add a method to the Alignment class that returns an unaligned alignment object
- Improve filter_n_tree so that it:
 - Reads an input alignment
 - Filters unwanted sequences (you choose criteria)
 - Unaligns the alignment and outputs it
 - Aligns it using an alignment tool (maybe muscle)
 - Builds a tree on the alignment using FastTree

Don't look at this ... Answer

```
def degap(sequence):
    return sequence.replace("-", "")

class Alignment(object):
    ...
    def unalign(self):
        ''' removes gaps from self. '''
        for (k,v) in self.sequences.items():
            self.sequences[k] = degap_seq(v)
```

Don't look at this ... Answer

```
def call_muscle(input_file_name,output_file_name):
    subprocess.check_call(["muscle", "-in", input_file_name,
                          "-out", output_file_name])

... [In the main part]
''' 1- read input'''
alg = Alignment()
alg.read_fasta(in_alg_file)
print "%d sequences were found in alg %s" %(len(alg.names()), in_alg_file)

''' 2- filter alignment and write to a file'''
filtered_alg = filter_alignment(alg,similarity_threshold, length_threshold)
assert filtered_alg.is_aligned(), "input file is not aligned"
filtered_seq_file = "%s.filtered.unaligned" %in_alg_file
filtered_alg.unalign()
filtered_alg.write_fasta(filtered_seq_file, safe_names = True)

''' 3- call muscle on it to realign'''
alignment_file_name = "%s.realigned" %filtered_seq_file
call_muscle(filtered_seq_file, alignment_file_name)

''' 4- call fasattree on muscle alignment'''
call_fasttree(alignment_file_name)
```

Now ...

- Quick look at some other topics ...

Do Generators help? timeit

```
import alignment
from timeit import timeit
a=alignment.Alignment()
a.add_sequence("s1", 'AC-GT'*1000)

timeit(lambda: a.has_gaps('s1'), number=10000)
```

```
def has_gaps(self, key):
    return any( (x=="-" for x in self.sequences[key]) )
```

0.01221609115600586

```
def has_gaps(self, key):
    return any( [x=="-" for x in self.sequences[key]] )
```

2.80867600440979

regex example

```
def degap(sequence):
    return sequence.replace("-", "")

import re
def degap_seq(sequence):
    return re.sub(r"[^a-zA-Z]", "", sequence)

matches = [ name for name in alg.names()
            if re.match(".*GTGA[AT]A.*", alg.sequence(name)) ]
print matches

motives = re.findall("AA[CG]G[AT][CG]", alg.sequence('Human'))
print motives
```

Dendropy: reading and manipulating trees

- First need to install dendropy
 - [http://pythonhosted.org/DendroPy/
downloading.html](http://pythonhosted.org/DendroPy/downloading.html)
 - Useful to have setuptools

Dendropy example

```
tree_str= subprocess.check_output( ["FastTree",
                                  "-nt", "-gtr",
                                  filtered_alg_file] )
print tree_str

from dendropy import Tree
tree = Tree.get_from_string(tree_str, 'Newick')
to_rem = tree.get_edge_set(lambda edge:
                           False if edge.head_node.label is None
                           or float(edge.head_node.label) > 0.99
                           else True)
for edge in to_rem:
    edge.collapse()

print tree.as_newick_string()

tree.write(open("%s.tre.contracted"%filtered_alg_file, 'w'), 'Newick')
```

Goal: read the fasttree and contract low support edges

Summary

- Classes are useful constructs in programming
 - They put data and functionality together, and allow you to create your own “types”
- Python has plenty of useful built-in functions (zip, all, any, etc.), language constructs (lambda, generators, etc.) and built-in libraries (re, timeit, sys, etc.)
 - Google your needs. Python likely already has it
- There are many 3rd party libraries; e.g. dendropy.
 - Usually easy to learn and use.