

The background of the image is a dark blue, textured surface that looks like the cover of a spiral-bound notebook. A horizontal row of metal spiral rings is visible along the top edge, suggesting it's a spiral-bound book or notebook.

Bioperl II

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Getting Sequences from GenBank

- Through Web Interface Bio::DB::GenBank (don't abuse!!)
- Alternative is to download all of genbank, index with Bio::DB::Flat (will be **much** faster in long run)

Sequence Retrieval Script

```
#!/usr/bin/perl -w
use strict;

use Bio::DB::GenPept;
use Bio::DB::GenBank;
use Bio::SeqIO;

my $db = new Bio::DB::GenPept();
# my $db = new Bio::DB::GenBank(); # if you want NT seqs
# use STDOUT to write sequences
my $out = new Bio::SeqIO(-format => 'fasta');

my $acc = 'AB077698';
my $seq = $db->get_Seq_by_acc($acc);
if( $seq ) {
    $out->write_seq($seq);
} else {
    print STDERR "cannot find seq for acc $acc\n";
}
$out->close();
```

Sequence Retrieval from Local Database

```
use Bio::DB::Fasta;  
  
my $db = Bio::DB::Fasta->new($dir_with_fa_files);  
  
my $seqstr = $db->seq('SEQUENCE1');  
my $seq_part = $db->seq('SEQUENCE2', 100 => 300);  
my $seqobj = $db->get_Seq_by_acc('SEQUENCE1');
```

Use Entrez Queries

```
use Bio::DB::GenBank;
use Bio::DB::Query::GenBank;
my $db = Bio::DB::GenBank->new;
my $query = Bio::DB::Query::GenBank->new
    (-db => 'nucleotide',
     -query => "Oryza[Organism] and EST[keyword]");
my $count = $query->count;
my @ids = $query->ids;

my $stream = $db->get_Stream_by_query($query);
while (my $seq = $stream->next_seq) {
    # do something with the sequence object
}

# set the IDs from a list
my $query = Bio::DB::Query::GenBank
    (-db => 'nucleotide',
     -ids => \@myids);
```

Bio::DB::Flat

For EMBL, Swissprot, Genbank formats

```
$db = Bio::DB::Flat->new(-directory => '/usr/share/emb1',
                           -dbname      => 'mydb',
                           -format      => 'emb1',
                           -index       => 'bdb',
                           -write_flag => 1);

$db->build_index('/usr/share/emb1/primate.embl',
                  '/usr/share/emb1/protists.embl');

$seq      = $db->get_Seq_by_id('BUM');
@sequences = $db->get_Seq_by_acc('DIV' => 'primate');
$raw      = $db->fetch_raw('BUM');
```

Sequence databases

- Represent Sequences, Features, Annotations
- Denormalize relationships
- Allow efficient queries for
 - “All exons in species X”
 - “All genes with description Y”
 - “Longest mRNA from each gene”

Feature databases

- BioPerl databases
 - Bio::DB::GFF
 - Bio::DB::SeqFeature
- SQL databases
 - EnsEMBL
 - Biosql
 - Chado
 - UCSC

Bio::DB::GFF

- Version 1 of a GFF database in BioPerl (LD Stein)
- Gbrowse backend
- Some limitations due to ambiguity in GFF spec
- Mysql, Postgres, flatfile implementations

Bio::DB::GFF usage

```
use Bio::DB::GFF;
# Open the sequence database
my $db      = Bio::DB::GFF->new( -adaptor => 'dbi:mysql:opt',
                                    -dsn     => 'dbi:mysql:elegans');

# fetch a 1 megabase segment of sequence starting at landmark "ZK909"
my $segment = $db->segment('ZK909', 1 => 1000000);
# pull out all transcript features
my @transcripts = $segment->features('transcript');

# for each transcript, total the length of the introns
my %totals;
for my $t (@transcripts) {
    my @introns = $t->Intron;
    $totals{$t->name} += $_->length foreach @introns;
}
```

GFF3 for two loci

```
ylip_A genbank gene 2659 5277 . + . ID=YALI0A00110g.gene;Dbxref=GeneID:2906259  
ylip_A genbank mRNA 2659 5277 . + . ID=YALI0A00110g; Parent=YALI0A00110g.gene;  
ylip_A genbank cds 2659 5277 . + . ID=50542874.cds1;Parent=YALI0A00110g
```

```
ylip_A genbank gene 529296 531064 . - . ID=YALI0A05027g.gene;Dbxref=GeneID:2905838  
ylip_A genbank mRNA 529296 531064 . - . ID=YALI0A05027g;Parent=YALI0A05027g.gene  
ylip_A genbank cds 530918 531064 . - . ID=50543212.cds1;Parent=YALI0A05027g  
ylip_A genbank cds 529296 529928 . - . ID=50543212.cds2;Parent=YALI0A05027g
```

Bio::DB::SeqFeature

- Fully handle GFF3 parent->child relationships
- Flatfile and mysql implementation
- Simpler interface than Bio::DB::GFF
- Only in Bioperl 1.5.2+

Write CDS seqs for GFF3 DB

Multiple Sequence Alignments

- Bio::AlignIO to read alignment files
- Produces Bio::SimpleAlign objects
- Interface and objects designed for round-tripping and some functional work
- Could really use an overhaul or a parallel MSA representation

Using AlignIO

```
use Bio::AlignIO;
my $in = Bio::AlignIO->new(-format => 'clustalw',
                           -file   => 'filename.aln');
my $out = Bio::AlignIO->new(-format => 'phylip',
                           -file   => '>slice.phy');

while( my $aln = $in->next_aln ) {
    print $aln->no_sequences," sequence in alignment\n";
    for my $sequence( $aln->each_seq ) {
        print $sequence->display_id, "\n";
    }
    my $slice = $aln->slice(10,30); # slice of alignment
    $out->write_aln($slice);
}
```

Graphics

- Simple code to render Sequence with ‘tracks’
- Basic component of Generic Genome Browser (GBrowse)
- Highly customizable, extensible

Generate a Graphics Panel

```
use Bio::Graphics;
use Bio::SeqIO;
use Bio::SeqFeature::Generic;

my $file = shift
  or die "provide a sequence file as the argument";
my $io = Bio::SeqIO->new(-file=>$file)
  or die "couldn't create Bio::SeqIO";
my $seq = $io->next_seq
  or die "couldn't find a sequence in the file";

my @features = $seq->all_SeqFeatures;

# sort features by their primary tags
my %sorted_features;
for my $f (@features) {
  my $tag = $f->primary_tag;
  push @{$sorted_features{$tag}}, $f;
}
my $panel = Bio::Graphics::Panel->new(
  -length => $seq->length,
  -key_style => 'between',
  -width     => 800,
  -pad_left  => 10,
  -pad_right => 10);

$panel->add_track(arrow =>
Bio::SeqFeature::Generic->new(-start => 1,
                                  -end   => $seq->length),
  -bump => 0,
  -double=>1,
  -tick  => 2);

$panel->add_track(generic =>
Bio::SeqFeature::Generic->new(-start => 1,
                                  -end   => $seq->length,
                                  -bgcolor => 'blue',
                                  -label   => 1,));

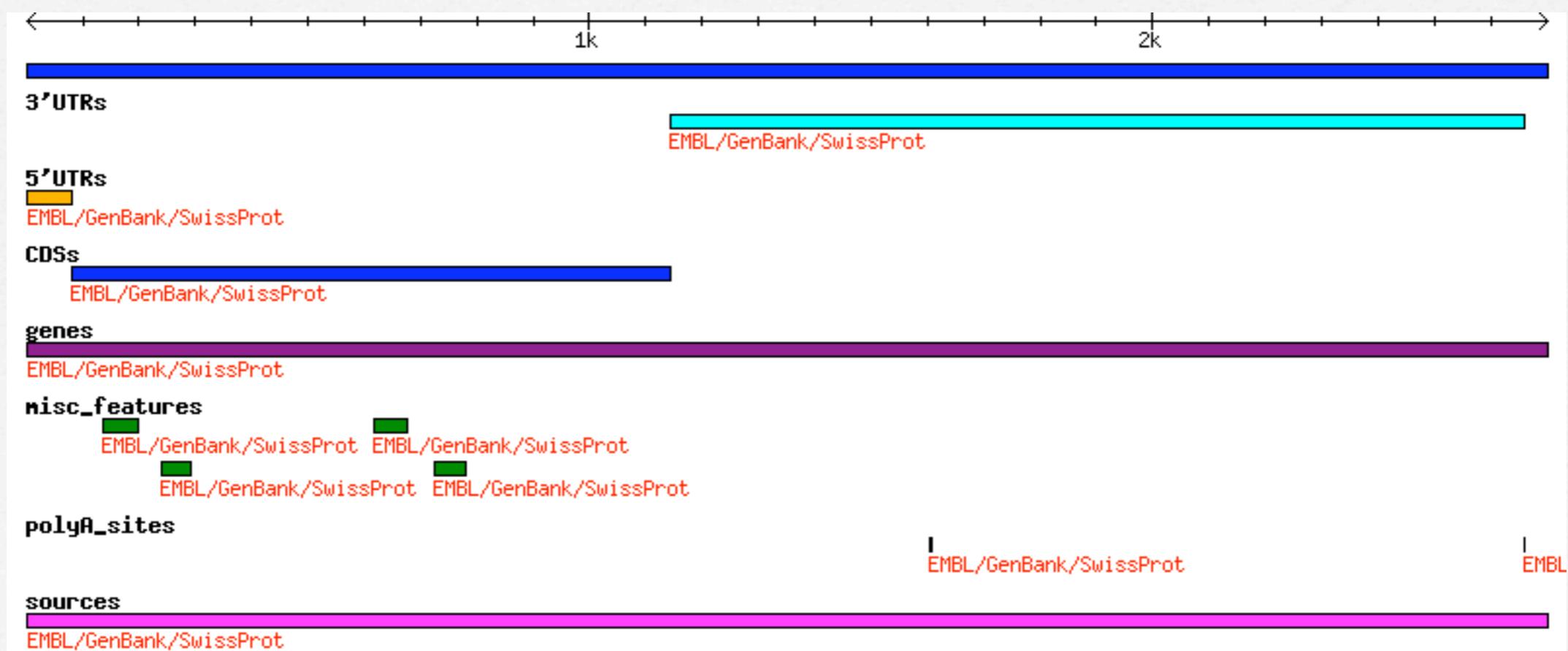
# general case
my @colors = qw(cyan orange blue purple green
                 chartreuse magenta yellow aqua);
my $idx      = 0;

for my $tag (sort keys %sorted_features) {
  my $features = $sorted_features{$tag};
  $panel->add_track($features,
    -glyph    => 'generic',
    -bgcolor  => $colors[$idx++ % @colors],
    -fgcolor  => 'black',
    -font2color => 'red',
    -key      => "${tag}s",
    -bump     => +1,
    -height   => 8,
    -label    => 1,
    -description => 1,
  );
}

print $panel->png;
```

Graphics output

```
[babelfish]$ perl graphics.pl AB077698.gbk > AB077698.png
```



Tools for Evolutionary and Population analyses

- Population Genetics Modules
- Taxonomy
- Molecular Evolution
- Phylogenetic Tree Building and Manipulation

Taxonomy data

- Local indexed files or access NCBI (HTTP)
- Also access to BioSQL
- scripts/taxa: local_taxonomydb_query,
taxid4species

Querying Local Taxonomy DB

Download nodesfile and namesfile from
NCBI /pub/taxonomy

```
use Bio::DB::Taxonomy;
my $db = Bio::DB::Taxonomy->new(
    -source  => 'flatfile',
    -nodesfile=> $nodefile,
    -namesfile=> $namesfile);
$node = $db->get_Taxonomy_Node(
-taxonid => '9606');
$node = $db->get_Taxonomy_Node(
-name => 'Homo sapiens');
```

Querying Remote Taxonomy DB

```
use Bio::DB::Taxonomy;  
my $db = new Bio::DB::Taxonomy(  
    -source => 'entrez');  
  
$node = $db->get_Taxonomy_Node(  
    -taxonid => '9606');  
$node = $db->get_Taxonomy_Node(  
    -gi => $gi); # lookup a taxonid for seq GI
```

careful! Like RemoteBlast and DB::GenBank you can
get your site cut off from NCBI!!

Put it together

```
use Bio::DB::Taxonomy;
use Bio::SearchIO;
my $db = Bio::DB::Taxonomy->new(
    -source  => 'flatfile',
    -nodesfile=> $nodefile,
    -namesfile=> $namesfile);
my $in = Bio::SearchIO->new(-format => 'fasta',
                             -file =>'blastfile.FASTX');

while( my $r = $in->next_result ) {
    while( my $h = $r->next_hit ) {
        my ($gi) = ( $h->name =~ /gi\|(\d+)/ );
        my $kingdom = &gi_to_kingdom($gi);
        if( $kingdom ) {
            $classify{$r->query_name}->{$kingdom}++;
        }
    }
}
```

```
sub gi_to_kingdom {
    my $gi = shift;
    my $taxid = $GI2TaxId{$gi}; # build a local index from NCBI files
    my $node = $TaxDB->get_Taxonomy_Node($taxid);
    if( ! $node ) {
        warn("cannot find node for gi=$gi ($hname) (taxid=$taxid)\n");
        next;
    }
    my $kingdom;
    my $nm = $taxon->scientific_name;
    while( my $n = $taxon->ancestor ) {
        my $rank = lc $n->rank;
        my $name = $n->scientific_name;

        if( $rank eq 'kingdom' ||
            $rank eq 'superkingdom' || $name eq 'viruses' ) {
            $kingdom = $name;
            last;
        }
        $taxon = $n;
    }
}
```

A replacement for Bio::Species?

- DB aware Taxonomy Nodes
- \$pnode = \$node->get_Parent_Node();
 - \$parentid = \$node->parent_id;
- my @class = \$node->classification;
- my \$division = \$node->division();
- \$node->name; \$node->scientific_name;

Molecular Evolution Tools

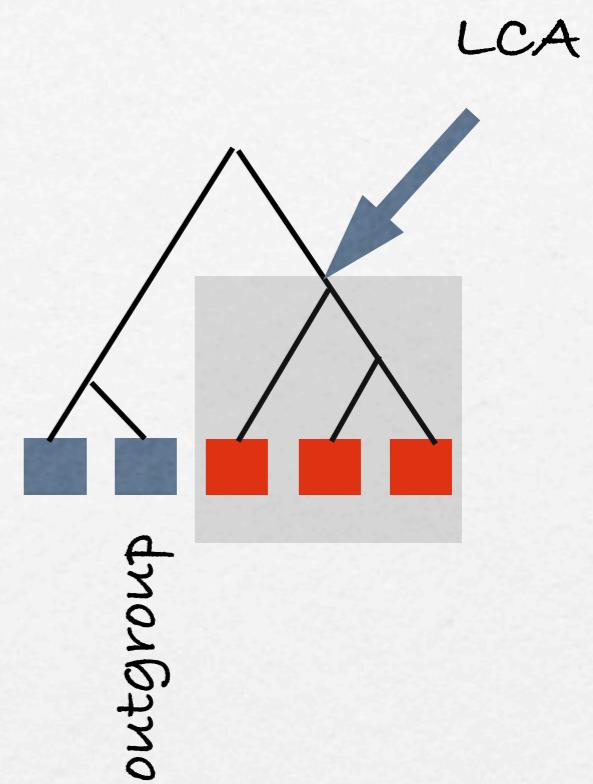
- Bio::Align::DNASTatistics - native calculation of distances, Ks,Ka
- Bio::Align::Utilities - translate aa to nt alignments
- Bio::Tools::Phylo::PAML - parse Codeml output
- Bio::Tools::Run::Phylo::PAML::Codeml - run Codeml (or YN00)

Phylogenetic Trees

- Support reading of Tree data
 - newick, nexus, nhx formats
- Manipulation of Trees
- Trees are connections of Nodes which have ancestor and children pointers

Simple Tree Routines

- Lowest Common Ancestor
- Tests of monophyly, paraphyly
- Reroot tree
- Distances between two nodes
- Find a node by name



Constructing Trees

- Bio::Tree::DistanceFactory has UPGMA, Neighbor-Joining implemented
- Build a matrix with Align::DNASTatistics or Align::ProteinStatistics OR read in one from Phylip with Bio::Matrix::IO
- Create NJ tree

Interfacing with Phylip

- Bioperl 1.5.1 supports Phylip 3.6
- Can run tools with bioperl-run package
- Bio::Tools::Run::Phylo::Phylip
 - ProtDist (also parser Bio::Matrix::IO)
 - Neighbor, ProtPars, SeqBoot, Consense
 - DrawGram, DrawTree

Reading/Writing a Tree

```
#!/usr/bin/perl -w
use Bio::TreeIO;
use strict;
my $in = Bio::TreeIO->new(-format => 'nexus',
                           -file    => 'trees.nex');
my $out = Bio::TreeIO->new(-format => 'newick',
                           -file    => '>trees.nh');
while( my $tree = $in->next_tree ) {
    $out->write_tree($tree);
}
```

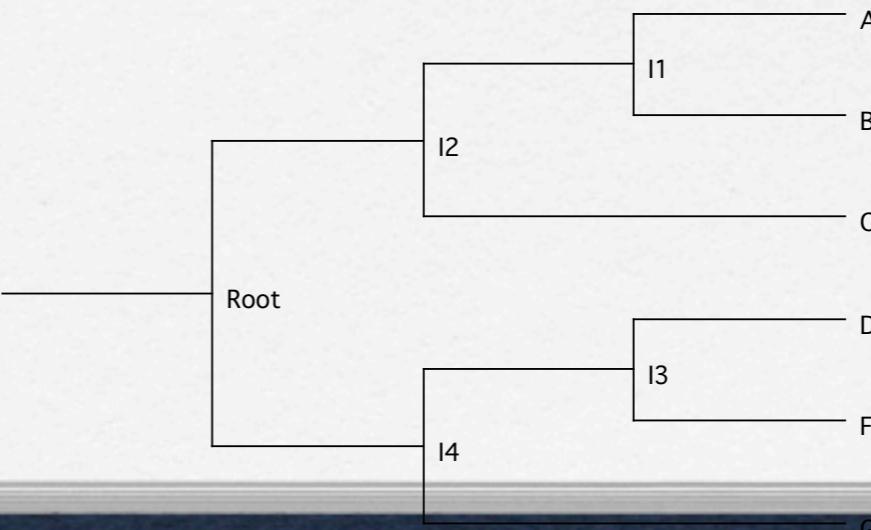
Fetching subset of nodes

```
#!/usr/bin/perl -w
use strict;
use Bio::TreeIO;
my $in = Bio::TreeIO->new(-format => 'newick',
                            -fh    => \*DATA);
if( my $tree = $in->next_tree ) {
    my @nodes = $tree->get_nodes;
    my @tips = grep { $_->is_Leaf } @nodes;
    print "there are ",scalar @tips, " tips\n";
    my @internal = grep { ! $_->is_Leaf } @nodes;
    print "there are ",scalar @internal, " internal
nodes\n";
    my ($A_node) = $tree->find_node(-id => 'A');
    print "branch length of Ancestor of ",$A_node->id,
          " is ", $A_node->ancestor->branch_length, "\n";
}
__DATA__
(((A:10,B:11):2,C:5),((D:7,F:6):17,G:8));
```

Walking up the tree (tips to root)

```
if( my $tree = $in->next_tree ) {  
    my @tips = grep { $_->is_Leaf } $tree->get_nodes;  
    for my $node ( @tips ) {  
        my @path;  
        while( defined $node ) {  
            push @path, $node->id;  
            $node = $node->ancestor;  
        }  
        print join(",", @path), "\n";  
    }  
}  
DATA  
(((A:10,B:11)I1:2,C:5)I2,((D:7,F:6)I3:17,G:8)I4)Root;
```

C,I2,Root
A,I1,I2,Root
B,I1,I2,Root
G,I4,Root
D,I3,I4,Root
F,I3,I4,Root



From Alignments to Trees

- Bio::AlignIO to parse the alignment
- Bio::Align::ProteinStatistics to compute pairwise distances
- Bio::Tree::DistanceFactory to build a tree based on a matrix of distances using NJ or UPGMA
- More sophisticated tree building should be done with tools like phylml, PAUP, MOLPHY, PHYLIP, MrBayes, or PUZZLE

Testing phylogenetic hypotheses

- No sophisticated ML methods are currently built in Bioperl for testing for phylogenetic correlations, etc
- Can export trees and use tools like Mesquite
- Work to be finished in Dec 2006 to fully integrate more phylogenetic tools into BioPerl

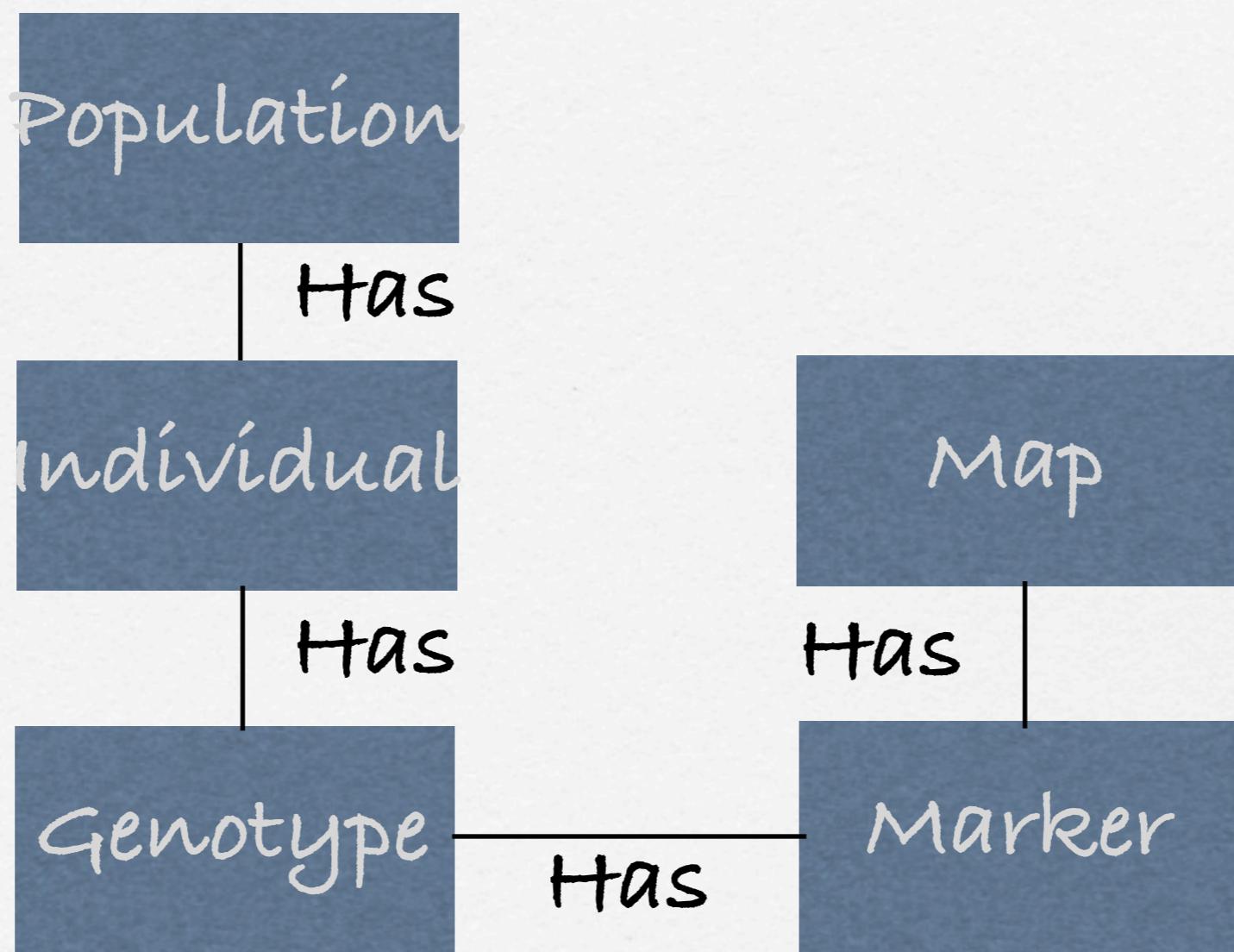
Bioperl & Population Genetics

- Basic data
 - Marker - polymorphic region of genome
 - Individual - individual sampled
 - Genotype - observed allele(s) for a marker in an individual
 - Population - collection of individuals
- See [http://bioperl.org/wiki/PopGen modules](http://bioperl.org/wiki/PopGen_modules)

The Players

- Bio::PopGen::Population - container for Individuals, calculate summary stats
- Bio::PopGen::Individual - container for Genotypes
- Bio::PopGen::Marker - summary info about a Marker (primers, genome loc, allele freq)
- Bio::PopGen::Genotype - pairing of Individual & Marker; allele container

Population Genetics Data Objects



Some Data Formats

- PrettyBase format (Seattle SNP data)

<i>MARKER</i>	<i>SAMPLEID</i>	<i>ALLEL1</i>	<i>ALLEL2</i>
ProcR2973EA	01	C	T
ProcR2973EA	02	N	N
ProcR2973EA	03	C	C
ProcR2973EA	04	C	T
ProcR2973EA	05	C	C

- Comma Delimited (CSV)

SAMPLE, MARKERNAME1, MARKERNAME2, ...

SAMPLE, ProcR2973EA, Marker2

sample-01,C T,G T

sample-02,C C,G G

- Phase format

```
3
5
P 300 1313 1500 2023 5635
MSSSM
#1
12 1 0 1 3
11 0 1 0 3
```

Reading in Data

```
use Bio::PopGen::IO;
my $in = Bio::PopGen::IO->new(-format => 'csv'
                               -file    => 'dat.csv');
my @pop;
while( my $ind = $in->next_individual ) {
    push @pop, $ind;
}
# OR
my $pop = $in->next_population;
```

Ready Built Stuff

- Bio::PopGen::PopStats - population level statistics (only F_{ST} currently)
- Bio::PopGen::Statistics - suite of Population Genetics statistical tests and summary stats.
- Bio::PopGen::Simulation::Coalescent - primitive Coalescent simulation
 - Basic tree topology and branch length assignment.

Using the Modules

```
use Bio::PopGen::Statistics;  
my $stats = Bio::PopGen::Statistics->new();  
my $pi = $stats->pi($population);  
# or use an array reference of Individuals  
my $pi = $stats->pi(\@individuals);  
# Tajima's D  
my $TajimaD = $stats->tajima_D($population);  
# Fu and Li's D  
my $FuLiD = $stats->fu_and_li_D($ingroup_pop,  
                                  $outgroup_ind);  
# Fu and Li's D*  
my $FLDstar = $stats->fu_and_li_D_star($population);  
  
# pairwise composite LD  
my %LDstats = $stats->composite_LD($population);  
my $LDarray = $LDstats{'marker1'}->{'marker2'};  
my ($ldval,$chisq) = @$LDarray;
```

Getting Data from Alignments

- use Bio::AlignIO to read in Multiple Sequence Alignment data
- Bio::PopGen::Utilities aln_to_population will build Population from MSA
 - Will make a “Marker” for every polymorphic site (or if asked every site)
 - Eventually will have ability to only get silent/non-silent coding sites

Automating PAML

- PAML - phylogenetic analysis with maximum likelihood
- Estimate synonymous and non-synonymous substitution rates
- Along branches of a tree or in a pairwise fashion

Preparing Data

- Multiple sequence alignments of protein coding sequence
- No stop codons!
- Must be aligned on codon boundaries
- Easiest way is to align at protein level, then project back into CDS alignment

Doing Protein Alignments

- Bio::Tools::Run::Alignment::Clustalw or Bio::Tools::Run::Alignment::MUSCLE or just prepare the sequence files and run the alignment programs via scripts
- Bio::AlignIO to parse the alignment data
- Bio::Align::Utilities to project back into CDS space

Build tree or assume a tree

- If doing analysis of genomes which have a known species tree - use that tree
- Branch lengths are not part of PAML. Multiple topologies can be provided to test alternative hypotheses (by comparing maximum likelihood values)

Running PAML

```
#!/usr/bin/perl -w
use strict;
use Bio::Tools::Run::Phylo::PAML::Codeml;
use Bio::AlignIO;
my $factory = Bio::Tools::Run::Phylo::PAML::Codeml->new(
    -params => { 'runmode' => -2,
                   'seqtype' => 1 });
my $alnio = Bio::AlignIO->new(-format => 'clustalw',
                               -file   => 'cds.aln');
my $aln = $alnio->next_aln; # get the alignment from file
$factory->alignment($aln); # set the alignment
my ($returncode,$parser) = $factory->run();
my $result = $parser->next_result;
my $MLmatrix = $result->get_MLMATRIX;

print "Ka = ", $MLmatrix->[0]->[1]->{ 'dN' }, "\n";
print "Ks = ", $MLmatrix->[0]->[1]->{ 'dS' }, "\n";
print "Ka/Ks = ", $MLmatrix->[0]->[1]->{ 'omega' }, "\n";
```

Parsing PAML

```
#!/usr/bin/perl -w
use strict;
use Bio::Tools::Phylo::PAML;
my $parser = Bio::Tools::Phylo::PAML->new
  (-file => 'results/mlc', -dir => 'results');
if( my $result = $parser->next_result ) {
  my @otus = $result->get_seqs;
  # get Nei & Gojobori dN/dS matrix
  my $NGmatrix = $result->get_NGmatrix;
  printf "%s and %s dS=% .4f dN=% .4f Omega=% .4f\n",
    $otus[0]->display_id, $otus[1]->display_id,
    $NGMatrix->[0]->[1]->{dS}, $NGMatrix->[0]->[1]->{dN},
    $NGMatrix->[0]->[1]->{omega};
}
```

Getting the Trees out

```
my @trees = $result->get_trees;
for my $tree ( @trees ) {
    print "likelihood is ", $tree->score, "\n";
    # do something else with the trees,
    # for non runmode -2 results
    # inspect the tree, branch specific rates
    # the "t" (time) parameter is available via
    # ("omega", "dN", etc.) are available via
    # ($omega) = $node->get_tag_values('omega');
    for my $node ( $tree->get_nodes ) {
        print $node->id, " t=", $node->branch_length,
            " omega ", $node->get_tag_values('omega');
    }
}
```

Running BLAST Remotely

- Allow submission of BLAST queries to NCBI via scripts
- Need to be careful - infinite loops, over submitting jobs can get your access shutdown!

```
use Bio::Tools::Run::RemoteBlast;
my $prog = 'blastp';
my $db   = 'ecoli';
my $e_val= 'le-10';
my $remote_blast = Bio::Tools::Run::RemoteBlast->new(
    -prog    => $prog,
    -data    => $db,
    -expect  => $e_val);
my $r = $remote_blast->submit_blast($inputfilename);
while( my @rids = $remote_blast->each_rid ) {
    for my $rid ( @rids ) {
        my $rc = $remote_blast->retrieve_blast($rid);
        if( ! ref($rc) ) {
            if( $rc < 0 ) { $remote_blast->remove_rid($rid); }
            print STDERR "."; sleep(10);
        } else {
            $remote_blast->remove_rid($rid);
            my $result = $rc->next_result;
            while( my $hit = $result->next_hit ) {
                print $hit->name, " ", $hit->significance, "\n";
            }
        }
    }
}
```

Fin