## Modules

<u>absl</u>

numpy

<u>os</u>

## **Functions**

main()

## mlforensics

index rnadeep/examples/mlforensics.py

## Modules

**RNA** 

numpy

<u>os</u>

# Functions

```
canon_bp(i, j)
```

get\_bp\_counts(seqs, structs)

julia\_looptypes(seqs, structs)

julia\_prediction(seqs, data)

Wenn ich richtig verstehe, wird ab Zeile 36 eine 0,1 Matrix gebaut, die 1 Einträge enthält wenn der NN output >0.5 war und der Eintrag der größte auf der Zeile ist. Kling gut, ausser dass auch pro Spalte höchstens eine 1 stehen darf. Wird die NN Matrix vielleicht vorher schon symmetrisch gemacht?

Der code failed auch, wenn der Maximalwert in einer Zeile doppelt vorkommt, aber das ist hoffentlich selten genug.

julia\_version(a)

main()

remove\_conflicts(a, seq=None)

## generate data

<u>index</u> <u>rnadeep/examples/generate\_data.py</u>

### **Modules**

numpy

<u>os</u>

random

### **Functions**

### main()

```
Generates random sequence data files.
datadir/datatype.fasta
'''
>rseq_{i}_{energy}
sequence
structure
>rseq_{i+1}_{energy}
sequence
structure
```

**train** (version v0.1)

index rnadeep/examples/train.py

## <u>Modules</u>

<u>absl</u>

argparse

<u>os</u>

# **Functions** main() RNAdeep training interface. python train.py -d l30 -t train\_data/fixlen30\_n100000.fa-train -v train\_data/fixlen30\_n100000.fa-valid -m 4 -b 250 -e 20 --modellog-dir intermediate\_models -l intermediate\_models/sm4\_l30\_010/ --epoch0 10 2>> sm4\_l30.err >> sm4\_l30.out & parse\_rnadeep\_args(p) Arguments that are used by RNAdeep. training(datatag, ftrain, fvalid, spotmodel=None, basemodel=None, savedir='.', epochs=50, epoch0=0, batch size=4) index predict rnadeep/examples/predict.pv **Modules** <u>absl</u> numpy <u>os</u> **Functions** main() **train ali** (version v0.1) rnadeep/examples/train ali.py **Modules** absl argparse <u>os</u> tensorflow **Functions** main() RNAdeep training interface. ${\color{red} \textbf{parse\_rnadeep\_args}(p)}$ Arguments that are used by RNAdeep. training(datatag, dbn dir, ali dir, spotmodel=None, basemodel=None, savedir='.', epochs=50, epoch0=0, batch size=4) index rfam filter rnadeep/rnaconv/rfam\_filter.py Modules os <u>sys</u> filter\_rfam\_data(ali\_dirpath, single\_freq\_dirpath, doublet\_freq\_dirpath, neigh\_wuss\_dirpath, neigh\_dbn\_dirpath, tree\_fixed\_dirpath, tree\_rescaled\_dirpath, max\_length=700) Filters the alignments, consensus structures, frequencies and trees of a converted rfam database (not touching the original tree files and original Rfam.seed file): Every data point (consisting of the four filetypes mentioned above) which alignment exceeds a certain length is removed. ali\_dirpath (str): Path to the directory of the converted alignments. single\_freq\_dirpath (str): Path to the directory of the extracted single frequency files. doublet\_freq\_dirpath (str): Path to the directory of the extracted doublet frequency files. neigh\_wuss\_dirpath (str): Path to the directory of the extracted wuss files. neigh\_dbn\_dirpath (str): Path to the directory of the extracted dbn files. tree\_fixed\_dirpath (str): Path to the directory of the fixed newick string tree files. tree\_rescaled\_dirpath (str): Path to the directory of the rescaled tree files max\_length (int, None, optional): Maximum allowed length of an alignment. Default is 700. main() index data filter rnadeep/rnaconv/data filter.py **Modules** <u>RNA</u> numpy os <u>sys</u> filter data(ali dirpath, seq dirpath, neigh dbn dirpath, neigh ct dirpath, max dbrs deviation=20) Filters the data generated by the data\_generator: In each alignment, every sequence is removed that

deviates by over <max\_dbrs\_deviation> from the consensus structure that was used by SISSI to generate it. This is achieved by using RNAfold to predict the secondary structure and the base pair distance to compare it to the desired consensus structure. If this results in all sequences being removed, the whole alignment with the corresponding consensus structure and sequence is removed.

Note: If families were generated, the consensus structures used for the alignment generation were generated by RNAfold and saved into the neigh\_dirpath.

If only alignments were generated, the consensus structures used for the generation were provided by the user, most likely from a converted Rfam database, but then copied to the neigh\_dirpath anyway, for the sake of integrity.

Therefore, in both cases, neigh\_dirpath can be used to retrieve the desired consensus structures to compare the sequences with.

### Parameters:

#### main()

**obtain\_and\_compare\_equilibrium\_frequencies**(ali\_dirpath, neigh\_dirpath, orig\_single\_freq\_dirpath, orig\_doublet\_freq\_dirpath, outpath)

Extracts the equilibrium frequencies for unpaired single nucleotides and nucleotide pairs from the generated alignments and forms the differences to the already extracted equilibrium frequencies of the original alignments.

#### Parameters:

ali\_dirpath (str): Path to the directory of the generated alignment files in CLUSTAL format
neigh\_dirpath (str): Path to the directory containing the alignment consensus structure files in dot bracket
 notation format
orig\_single\_freq\_dirpath (str): Path to the directory of the extracted single frequency files of the
 original alignments
orig\_doublet\_freq\_dirpath (str): Path to the directory of the extracted doublet frequency files of the
 original alignments

outpath (str): Path to the directory in which to save the extracted unpaired single and paired nucleotide equilibrium frequencies and frequency differences

# data\_generator

index rnadeep/rnaconv/data\_generator.py

#### Modules

RNA os subprocess argparse random

### **Functions**

### db to ct(dbn, seq)

Converts the consensus structures contained in the dot bracket notation input file into the connect table format.

#### Parameters

dbn (str): Secondary structure in dot bracket notation seg (str): Sequence

generate\_alignment\_set(sissi\_filepath, number, tree\_dirpath, neigh\_dirpath, sfreq\_dirpath, dfreq\_dirpath, ali\_dirpath, outpath)
Generates <number> alternative alignments for each tree file in the given tree-directory, searching in the
respectively given consensus-structure-, single- & doublet-frequencies- and, optionally for readding
ndels, alignment-directories for files of the same name to use.

#### Parameters:

sissi\_filepath (str): Path to the compiled sissi099 file
number (int): The number of alignments to generate
tree\_dirpath (str): Path to a directory containing tree files in the newick string format ('.seed\_tree')
neigh\_dirpath (str): Path to a directory containing neighbourhood files in the dot-bracket notation format ('.dbn')
sfreq\_dirpath (str): Path to a directory containing files storing a single frequency vector ('.sfreq')
dfreq\_dirpath (str): Path to a directory containing files storing a doublet frequency vector ('.dfreq')
ali\_dirpath (str, None): Path to a directory containing alignment files in the clustal format ('.aln')
outpath (str): The Path to which to write the generated sequences, alignments & copied consensus structures

generate\_alignments(sissi\_filepath, number, tree\_filepath, neigh\_filepath, sfreq\_filepath, dfreq\_filepath, ali\_filepath, outpath)
Generates <number> alternative alignments for the given tree-, consensus-structure-, single- & doublet-frequenciesand, optionally for readding indels, alignment-file, using:

- RNAinverse to generate an ancestral sequence for the provided consensus structure

- SISSI simulate homologous sequence alignments (taking the generated ancestral sequence, provided tree, provided consensus structure and provided equilibrium frequencies as input).

#### Note:

The provided consensus structure will also be copied into an additional file per generated alignment, in order to create pairs of samples and tags to be used for training (during the process, the dbn files are converted to ct files, which are also saved).

The generated ancestral sequence will also be saved to maintain integrity.

#### Parameters

sissi\_filepath (str): Path to the compiled sissi099 file
number (int): The number of alignments to generate
tree\_filepath (str): Path to a directory containing tree files in the newick string format ('.seed\_tree')
neigh\_filepath (str): Path to a directory containing neighbourhood files in the dot-bracket notation format ('.dbn')
sfreq\_filepath (str): Path to a directory containing files storing a single frequency vector ('.sfreq')
dfreq\_filepath (str): Path to a directory containing files storing a doublet frequency vector ('.dfreq')
ali\_filepath (str, None): Path to a directory containing alignment files in the clustal format ('.aln')
outpath (str): The Path to which to write the generated sequences, alignments & copied consensus structures

generate\_families(sissi\_filepath, number, min\_length, max\_length, tree\_filepath, sfreq\_filepath, dfreq\_filepath, outpath)

- Generates <number> families for the given tree- and single- & doublet-frequencies-file, using:
   random ancestral sequences of uniformly distributed lengths up to <maxlength>
  - RNAfold to predict secondary structures for these sequences to be used as consensus structures for the alignment generation
  - SISSI simulate corresponding homologous sequence alignments (taking the random ancestral sequences, provided tree, predicted consensus structures, and provided equilibrium frequencies as input).

#### Note:

During the process, the generated dbn files are converted to ct files, which are also saved.

#### Parameters:

sissi\_filepath (str): Path to the compiled sissi099 file
number (int): The number of families to generate
min\_length (int): Minimum allowed length of the ancestral sequences used to generate the families
max\_length (int): Maximum allowed length of the ancestral sequences used to generate the families
tree\_filepath (str): Path to a tree file in the newick string format ('.seed\_tree')
sfreq\_filepath (str): Path to a file containing a single frequency vector ('.sfreq')
dfreq\_filepath (str): Path to a file containing a doublet frequency vector ('.dfreq')
outpath (str): The path to which to write the generated families

generate\_family\_set(sissi\_filepath, number, min\_length, max\_length, tree\_dirpath, sfreq\_dirpath, dfreq\_dirpath, outpath)
Generates <number> RNA families of uniformaly distributed lengths up to <maxlength> for each tree file in the given
tree-directory, searching in the respectively given single- & doublet-frequencies-directories for files of the same

For more information, refer to the generate\_families() function.

#### Parameters:

sissi\_filepath (str): Path to the compiled sissi099 file
number (int): The number of families to generate
min\_length (int): Minimum allowed length of the ancestral sequences used to generate the families
max\_length (int): Maximum allowed length of the ancestral sequences used to generate the families
tree\_dirpath (str): Path to a directory containing tree files in the newick string format ('.seed\_tree')
sfreq\_dirpath (str): Path to a directory containing files storing a single frequency vector ('.sfreq')
dfreq\_dirpath (str): Path to a directory containing files storing a doublet frequency vector ('.dfreq')
outpath (str): Path to which to write the generated families

### $\textbf{generate\_sequence\_structure\_pair} (length=85, \\ min\_paired\_sites\_percent=20)$

Repeatedly generates a random sequence and predicts its secondary structure using RNAfold, until the structure has at least min\_paired\_sites paired sites.

#### Parameters:

length (int, optional): Length of the random sequence min\_paired\_sites\_percent (int, optional): Minimal required sites to be paired in percent

#### main()

setup\_args(parser)

# rfam converter

index rnadeep/rnaconv/rfam\_converter.py

### Modules

RNA os sys numpy shutil textdistance

#### **Functions**

### convert\_rfam\_data(seed\_filepath, tree\_dirpath, outpath)

Calls the necessary functions to convert the whole rfam database into single files, preparing them to be used by SISSI.

#### Parameters

seed\_filepath (str): Path to the Rfam.seed file in STOCKHOLM format, containing the families
tree\_dirpath (str): Path to the directory in which Rfam tree files in newick format (.seed\_tree) files are
located
outpath (str): Path to the directory in which to save the converted data

#### fix\_newick\_strings(tree dirpath, outpath)

Fixes newick strings by replacing every control character (e.g. '(', ')', ',', '.', ':') within a node name with an underscore.

Additionally, multifurcations are resolved and non-leaf node labels are removed. (These three steps are nessecary for SISSI to be able to parse the Rfam tree files.)

#### Parameters

tree\_dirpath (str): path to the directory containing the tree files in newick string format
outpath (str): path to the directory in which to save the trees in the fixed newick string format.

#### main()

### obtain\_equilibrium\_frequencies(ali\_dirpath, neigh\_dirpath, outpath)

Extracts the equilibrium frequencies for unpaired single nucleotides and nucleotide pairs from an alignment, by counting the occurences of single nucleotides in unpaired site and saving them in a 4-vector, counting the occurences of nucleotide pairs in paired sites and saving them in a 16-vector, adding pseudocounts to both (+1 for each element) and normalizing in the end.

#### ${\tt Parameters}$

equilibrium frequencies

#### **rescale newick strings**(tree dirpath, ali dirpath, outpath)

Rescales the tree branch lengths for trees which corresponding sequence alignments sequences are over 95% similar with respect to their mean pairwise hamming distance, in order to increase the evolution rate when using the tree for evolutionary simulation.

The rescale factor is 2.

#### Parameters:

tree\_dirpath (str): path to the directory containing the tree files in newick string format ali\_dirpath (str): path to the directory containing the alignment files in CLUSTAL format outpath (str): path to the directory in which to save the rescaled trees in the newick string format.

### stockholm\_to\_alignments(filepath, outpath)

Converts the alignments contained in the STOCKHOLM input file into CLUSTAL files.

#### Parameters:

filepath (str): Path to the Rfam.seed file in STOCKHOLM format, containing the families outpath (str): Path to the directory in which to save the extracted alignments in the CLUSTAL format

#### stockholm to neighbourhoods(filepath, outpath)

Calls the necessary functions to convert the consensus structures contained in the STOCKHOLM input file into single files in the wuss and dbn formats, respectively.

#### Parameters:

filepath (str): Path to the Rfam.seed file in STOCKHOLM format, containing the families outpath (str): Path to the directory in which to save the extracted consensus structures

#### stockholm\_to\_wuss(filepath, outpath)

Converts the consensus structures contained in the STOCKHOLM input file into single files in the washington university secondary structure (wuss) format.

#### Parameters:

filepath (str): Path to the Rfam.seed file in STOCKHOLM format, containing the families outpath (str): Path to the directory in which to save the resulting wuss file

### wuss\_to\_db(filepath, outpath)

Converts the consensus structures contained in the wuss input file into the dot bracket notation format

#### Parameters:

filepath (str): Path to the file in wuss format, containing the secondary structure outpath (str): Path to the directory in which to save the resulting dot bracket notation file

## lstm\_models

index rnadeep/rnadeep/lstm models.py

### Modules

keras.api.\_v2.keras.backend numpy os tensorflow

## Fun<u>ctions</u>

blstm(lstm layers=1, lstm neurons=20)

complex\_blstm(lstm\_layers=1, lstm\_neurons=40)

# metrics

index rnadeep/rnadeep/metrics.py

### Modules

<u>keras.api.\_v2.keras.backend</u> <u>numpy</u> <u>tensorflow</u>

### **Functions**

f1(y true, y pred)

focal\_loss(gamma=2.0, alpha=0.75)

 $\boldsymbol{matthews correlation}(y\_true,\ y\_pred)$ 

 $\boldsymbol{mcc}(y\_true,\,y\_pred)$ 

sensitivity(y\_true, y\_pred)

specificity(y\_true, y\_pred)

init (version v0.1)

index rnadeep/rnadeep/ init .py

rnadeep/rnadeep/sliding window.py

sliding window

```
Modules

keras.api._v2.keras.backend numpy tensorflow

Functions

basic_window(window_size)

basic_window_leakyrelu(window_size)
```

# Data

```
absolute_import = _Feature((2, 5, 0, 'alpha', 1), (3, 0, 0, 'alpha', 0), 262144) division = _Feature((2, 2, 0, 'alpha', 2), (3, 0, 0, 'alpha', 0), 131072) print_function = _Feature((2, 6, 0, 'alpha', 2), (3, 0, 0, 'alpha', 0), 1048576) unicode_literals = _Feature((2, 6, 0, 'alpha', 2), (3, 0, 0, 'alpha', 0), 2097152)
```

### models

<u>index</u> rnadeep/rnadeep/models.py

### **Modules**

<u>keras.api.\_v2.keras.layers</u> <u>tensorflow</u>

conv\_window(window size)

#### **Functions**

```
{\bf spotrna\_alignment\_models} ({\tt model=1}, \, {\tt use\_mask=True})
     Some modifications to Julia's SPOT-RNA implementations.
     Supposed to be a reimplementation of the models in the
     SPOT-RNA paper. If you find mistakes, please let us know!
     Overview:
             - Initial 3x3 convolution layer
             - ResNet blocks
             - Act./Norm.
             - 2D-BLSTM
             - Fully Connected blocks
             - Output masking layer (optional)
             - Output layer
     Args:
             model: select the model (0-4)
             use_mask: for padded input/output (defaults to True!)
spotrna_models(model=1, use mask=True)
     Some modifications to Julia's SPOT-RNA implementations.
     Supposed to be a reimplementation of the models in the
     SPOT-RNA paper. If you find mistakes, please let us know!
     Overview:
             - Initial 3x3 convolution layer
             - ResNet blocks
             - Act./Norm.
             - 2D-BLSTM
             - Fully Connected blocks
             - Output masking layer (optional)
             - Output layer
     Args:
             model: select the model (0-4)
             use_mask: for padded input/output (defaults to True!)
```

# encoding\_utils

<u>index</u> <u>rnadeep/rnadeep/encoding\_utils.py</u>

#### **Modules**

numpy

## Functions

```
base_pair_matrix(ss)
```

binary\_encode(structure)

create\_windows(sequences, window\_size)

encode\_padded\_alignment\_matrix(alignments, max\_length=None)

```
{\bf encode\_padded\_sequence\_matrix} (sequences, \ max\_length = None)
encode_padded_structure_matrix(structures, max_length=None)
encode sequence(sequences)
encode_sequence_matrix(sequences)
     Make a BP probability matrix with one-hot encoding of basepairs.
     NOTE: This only works if all sequences have the same length, otherwise
     you need to use: encode_padded_sequence_matrix
encode_sequence_windows(sequences, window_size)
encode structure(structures)
encode_structure_matrix(structures)
     Make a BP probability matrix with one-hot encoding of basepairs.
     NOTE: This only works if all sequences have the same length!
make pair table(ss, base=0, chars=['.'])
     Return a secondary struture in form of pair table.
     Args:
      ss (str): secondary structure in dot-bracket format
      base (int, optional): choose between a pair-table with base 0 or 1
      chars (list, optional): a list of characters to be are ignored, default:
     **Example:**
       base=0: ((...)). => [5,4,-1,-1,1,0,-1]
            i.e. start counting from 0, unpaired = -1
       base=1: ((..)). => [7,6,5,0,0,2,1,0]
            i.e. start counting from 1, unpaired = 0, pt[0]=len(ss)
       [list]: A pair-table
one_hot_encode(char)
one_hot_matrix(seq)
profile vec matrix(ali)
     Creates a profile matrix for the given alignment: For each cell a ij, the columns i and j or the alignment are
     combined by forming the outer product of two profile vectors for the two respective symbols at the current row
     index of the two columns and summing them all up. The two respective profile vectors created by the sheme defined in
     the base to ids dictionary variable.
```

sampling ali

index rnadeep/rnadeep/sampling ali.py

**Modules** 

numpy

os

Functions

draw\_ali\_sets(ali\_directory, dbn\_directory, splits=None)

parse\_families(ali\_dirpath, dbn\_dirpath)

Combines pairs of the same name of alignment CLUSTAL files and neighbourhood Dot Bracket String files found in the respective directories to be used for training.

Parameters:

ali\_dirpath (str): Path to the directory containing the alignment CLUSTAL files dbn\_dirpath (str): Path to the directory containing the neighbourhood Dot Bracket String files

parse family(ali filepath, dbn filepath)

Reads an alignment CLUSTAL file and neighbourhood Dot Bracket String file and combines them into a pair to be used for training.

Parameters:

ali filepath (str): Path to the alignment CLUSTAL file dbn filepath (str): Path to the neighbourhood Dot Bracket String file

sampling

rnadeep/rnadeep/sampling.py

Modules

numpy <u>os</u> random

**Functions** 

draw\_sets(fname, splits=None)

generate random structures(lengths)

index

```
rseq(l)
write_data_file(data, fname, mode='w')
    Save sequence/structure pairs for the given lengths.
write_fixed_len_data_file(seqlen, num, root='')
write_normal_len_data_file(central, std, num, root='')
write_uniform_len_data_file(minlen, maxlen, num, root='')
```