Modules

<u>absl</u>

numpy

<u>os</u>

Functions

main()

mlforensics

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

rnadeep/examples/generate_data.py

Modules

numpy

<u>os</u>

 \underline{random}

Functions

main()

```
Generates random sequence data files.

datadir/datatype.fasta
'''
>rseq_{i}_{energy}

sequence
structure
>rseq_{i+1}_{energy}

sequence
```

train (version v0.1)

structure

index rnadeep/examples/train.py

Modules absl 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 -model-log-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 os Functions main() train ali (version v0.1) rnadeep/examples/train ali.pv **Modules** absl argparse tensorflow os **Functions** main() RNAdeep training interface. 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 alignment_filter rnadeep/rnaconv/alignment filter.py **Modules RNA** numpy os **SYS Functions** filter alignments(path, rfam path, max dbrs deviation) Filters the alignments generated by the alignment_generator: In each alignment, every sequence is removed that deviates by over <max_dbrs_deviation> from the given consensus structure. This is achieved using RNAfold to predict the 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 file with the corresponding consensus structure file copy is removed. Parameters: path (str): path directory of the generated families. Expects the following folder structure: - alignments - neighbourhoods - ct - dbn rfam_path (str): path to the directory of the convered rfam database. Only used to retrieve the consensus structure, therefore expects the following folder structure: - seed_neighbourhoods - ct - dbn max_dbrs_deviation (int): maximum allowed base pair distance deviation from the consensus structure in percent. Default is 20. main() obtain_sissi_frequencies(path, rfam_path)

alignment and forms the differences to the already extracted equilibrium frequencies of the original rfam alignments. Parameters: path (str): path directory of the generated families. Expects the following folder structure: - alignments - neighbourhoods - ct - dbn rfam_path (str): path to the directory of the convered rfam database. Only used to retrieve the alignment, consensus structure and original equilibrium frequencies, therefore expects the following folder structure: - seed alignments - seed_frequencies - single - doublet - seed neighbourhoods - ct - dbn - nei - wuss **Data** default_max_dbrs_deviation = 20 rfam filter rnadeep/rnaconv/rfam filter.pv **Modules** <u>os</u> sys Functions filter_rfam_data(rfam_path, max_length) Filters the alignments, consensus structures, frequencies and trees of the converted rfam database: Every data point (consisting of the four filetypes mentioned above) which alignment exceeds a certain length is removed. Parameters: rfam_path (str): path to the directory of the convered rfam database. Expects the following folder structure: - seed_alignments - seed frequencies - single - doublet - seed_neighbourhoods - ct - dbn - nei - wuss - seed_trees - original - fixed rescaled max_length (int): maximally allowed length of an alignment. 700 by default. main() **Data** $default_max_length = 700$ family filter rnadeep/rnaconv/family filter.pv **Modules RNA** numpy <u>os</u> **SVS Functions** filter_alignments(path, max dbrs deviation) Filters the alignments generated by the family_generator: In each alignment, every sequence is removed that

deviates by over <max dbrs deviation> from the desired consensus structure. This is achieved using RNAfold to predict the 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 file with the corresponding consensus structure file is

removed.

Parameters:

Extracts the equilibrium frequencies for unpaired single nucleotides and nucleotide pairs from the generated

```
- neighbourhoods
                                            - ct
                                            - dbn
                                    - sequences
                            max dbrs deviation (int):
       main()
Data
       default max dbrs deviation = 20
                                                                                                                                  index
alignment generator
                                                                                            rnadeep/rnaconv/alignment generator.pv
Modules
       RNA
                                       os
                                                                       subprocess
                                                                                                       <u>sys</u>
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
                            seq (str): sequence
       generate_alignment_set(sissi filepath, n, tree dirpath, neigh dirpath, sfreq dirpath, dfreq dirpath, ali dirpath, outpath)
            Generates n RNA alignments for each combination of tree, consensus structure, single frequency & double frequency
            and alignment files with the same name in the respective directories.
            For more information, refer to the generate_alignments() function.
                            sissi_filepath (str): path to the compiled sissi099 file
                            n (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 sissi01 format ('.nei')
                            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): path to a directory containing alignment files in the clustal format ('.aln')
                            outpath (str): The path to which to write the generated alignments
       generate_alignments(sissi_filepath, n, tree_filepath, neigh_filepath, sfreq_dfilepath, dfreq_filepath, ali_filepath, outpath)
            Generates n RNA alignments using sissi for given equilibrium frequencies, neighbourhood system and phylogenetic tree.
            The raw alignments are used to re-add the indels.
            Note: The provided consensus structure will also be copied into one additional file per generated alignment, in order to
            create pairs of samples and tags to be used to train a model.
                            sissi filepath (str): path to the compiled sissi099 file
                            n (int): The number of alignments to generate
                            tree_filepath (str): path to a tree file in the newick string format ('.seed_tree')
                            neigh_filepath (str): path to a neighbourhood file in the sissi01 format ('.nei')
                            sfreq_dfilepath (str): path to a file containing a single frequency vector ('.sfreq')
                            dfreq filepath (str): path to a file containing a doublet frequency vector ('.dfreq')
                            ali filepath (str): path to an alignment file in the clustal format ('.aln')
                            outpath (str): The path to which to write the generated alignments
       get paths(rfam path)
            Accepts a path to a converted rfam database and returns the individual paths for the tree, consensus structure,
            frequency and alignment files.
                            rfam path (str): path to a converted rfam database
       main()
```

<u>subprocess</u>

<u>sys</u>

index

rnadeep/rnaconv/rfam converter.pv

textdistance

path (str): path directory of the generated families. Expects the following folder structure:

- alignments

Functions

Modules

rfam converter

<u>os</u>

shutil

RNA

numpy

convert_rfam_data(seed_filepath, ali_outpath, neigh_outpath, freq_outpath, tree_path, tree_fixed_outpath,
tree rescaled outpath)

Calls the nessecary 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
ali_outpath (str): path to the directory in which to save the extracted alignments in the CLUSTAL format
neigh_outpath (str): path to the directory in which to save the extracted consensus structures in the

- wuss
- dbn
- ct - nei

formats, respectively

freq_outpath (str): path to the directory in which to save the extracted paired and unpaired nucleotide equilibrium frequencies

tree_path (str): path to the directory in which Rfam tree files in newick format (.seed_tree) files are located

tree_fixed_outpath (str): path to the directory in which to save the fixed tree newick strings
tree_rescaled_outpath (str): path to the directory in which to save the rescaled tree newick strings

ct_to_nei(filepath, outpath)

Converts the consensus structures contained in the connect table input file into the sissi0.1 (.nei) format Note: SISSI can also use connect table files directly, but this filetype is used for obtaining the equilibrium frequencies later on.

Parameters:

filepath (str): path to the file in connect table format, containing the secondary structure outpath (str): path to the directory in which to save the resulting sissi0.1 (.nei) file

db_to_ct(filepath, outpath)

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

Parameters:

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

fix newick strings(treedirpath, 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:

treedirpath (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(alidirpath, neighdirpath, outpath)

Extracts the equilibrium frequencies for unpaired single nucleotides and nucleotide pairs from an alignment.

It counts the occurences of single nucleotides per unpaired site and saves them in a 4-vector. Then It counts the occurences of nucleotide pairs per paired site tuple and saves them in a 16-vector. Then it adds pseudocounts (+1 for each element) and normalizes.

Parameters:

alidirpath (str): path to the directory containing the alignment files in CLUSTAL format neighdirpath (str): path to the directory containing the alignment consensus structure files in sissi0.1 (.nei) format

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

rescale_newick_strings(treedirpath, alidirpath, 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:

treedirpath (str): path to the directory containing the tree files in newick string format alidirpath (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.

${\bf stockholm_to_alignments} ({\it filepath, outpath})$

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)

Converts the consensus structures contained in the STOCKHOLM input file into single files in the following formats:

- wuss
- dbn
- ct
- nei

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 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 wass 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

family generator

index rnadeep/rnaconv/family_generator.py

Modules

RNA os random subprocess <u>sys</u>

Functions

db_to_ct(dbn, seq)

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

Parameters:

generate_family(sissi_filepath, n, length, tree_filepath, sfreq_filepath, dfreq_filepath, outpath)

Generates n RNA families (consisting of an alignment and a secondary structure) for the given equilibrium frequencies and phylogenetic tree, using:

- a random ancestral sequence
- RNAfold to predict a consensus structure for that sequence
- SISSI simulate a corresponding homologous sequence alignment (taking the sequence, tree, and equilibrium frequencies as input).

Parameters:

sissi_filepath (str): Path to the compiled sissi099 file
n (int): The number of families to generate
length (int): Length of the ancestral sequence used to generate the family
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, n, length, tree dirpath, sfreq dirpath, dfreq dirpath, outpath)

Generates n RNA families of a certain length for each combination of tree, single frequency & double frequency files with the same name in the respective directories.

For more information, refer to the $\underline{\texttt{generate_family}}(\texttt{)}$ function.

Parameters:

sissi_filepath (str): Path to the compiled sissi099 file
n (int): The number of families to generate
length (int): 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

generate_sequence_structure_pair(length=85, min_paired_sites=0)

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 (int, optional): Minimal required sites to be paired

get_paths(rfam_path)

Accepts a path to a converted rfam database and returns the individual paths for the tree and frequency files.

Parameters:

rfam path (str): path to a converted rfam database

main()

lstm_models		ind
Istiii_iiioueis		<u>rnadeep/rnadeep/lstm_models.</u>
Modules		
keras.apiv2.keras.back	end numpy	os <u>tensorflow</u>
Functions blstm(lstm_layers=1, lst	m neurons=20)	
complex_blstm(lstm lay		=40)
• • • • • • • • • • • • • • • • • • •		
		ind.
metrics		rnadeep/rnadeep/metrics.
Modules		
keras.apiv2.keras.back	end numpy	tensorflow
Functions 61(v. true v. prod)		
f1(y_true, y_pred)	-lk- 0.75)	
focal_loss(gamma=2.0, a		
matthewscorrelation(y	_true, y_prea)	
mcc(y_true, y_pred)	1)	
sensitivity(y_true, y_pre		
specificity (y_true, y_pre	α)	
		ind
init (version v0.1)		rnadeep/rnadeep/init
sliding_window		<u>ind</u>
Modules		
keras.apiv2.keras.back	end <u>numpy</u>	<u>tensorflow</u>
Functions		
basic_window (window_s	size)	
basic_window_leakyrel	u (window_size)	
conv_window(window_s	ize)	
Data		
		1), (3, 0, 0, 'alpha', 0), 262144) 0, 'alpha', 0), 131072)
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)		
unicode_interais = _Fea	ture((2, 0, 0, aipha'	2), (3, 0, 0, aiplia, 0), 209/132)

models

index rnadeep/rnadeep/models.py

Modules

keras.api._v2.keras.layers $\underline{tensorflow}$

 ${\bf spotrna_alignment_models} ({\tt model=1}, \ {\tt use_mask=True})$

```
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!
             - 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

rnadeep/rnadeep/encoding utils.p

Modules

numpy

Functions

```
base pair matrix(ss)
binary_encode(structure)
create_windows(sequences, window size)
encode padded alignment matrix(alignments, max length=None)
encode padded sequence matrix(sequences, max length=None)
{\bf encode\_padded\_structure\_matrix} ({\tt 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.
      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:
            ['.']
       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)
           Returns:
             [list]: A pair-table
       one\_hot\_encode(char)
       one_hot_matrix(seq)
       profile_vec_matrix(ali)
                                                                                                                          index
sampling ali
                                                                                               rnadeep/rnadeep/sampling ali.py
Modules
       numpy
                                     <u>os</u>
Functions
       draw_ali_sets(ali_directory, dbn_directory, splits=None)
       parse_alignment(ali_path, dbn_path, filename)
       parse_alignments(ali_directory, dbn_directory)
sampling
                                                                                                   rnadeep/rnadeep/sampling.py
Modules
                                                                   <u>random</u>
       numpy
                                     <u>os</u>
Functions
       draw_sets(fname, splits=None)
       {\bf generate\_random\_structures} (lengths)
       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=")
```