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**dmae**

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**CHAPTER  
ONE**

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## **INSTALLATION**

You can install `dmae` from PyPI using pip, from the source [Github repository](#) or pulling a preconfigured docker image.

### **1.1 PyPI**

To install `dmae` using pip you can run the following command:

```
pip install dmae
```

*(optional) If you have an environment with the nvidia drivers and CUDA, you can instead run:*

```
pip install dmae-gpu
```

### **1.2 Source**

You can clone the `dmae` repository as follows:

```
git clone https://github.com/juselara1/dmae.git
```

You must install the requirements:

```
pip install -r requirements.txt
```

*(optional) If you have an environment with the nvidia drivers and CUDA, you can instead run:*

```
pip install -r requirements-gpu.txt
```

Finally, you can install `dmae` via setuptools

```
pip install --no-deps .
```

## 1.3 Docker

You can pull a preconfigured docker image with `dmae` from DockerHub:

```
docker pull juselara/dmae:1.1.0
```

*(optional) If you have the nvidia drivers installed, you can pull the following image:*

```
docker pull juselara/dmae:1.1.0-gpu
```

## 2.1 dmae package

### 2.1.1 Submodules

### 2.1.2 dmae.dissimilarities module

The `dmae.dissimilarities` module implements several dissimilarity functions in tensorflow.

`dmae.dissimilarities.chebyshev(X, Y)`

Computes a pairwise Chevyshev distance between two matrices  $\max(|\mathbf{x}_i - \mathbf{y}_j|)$ .

#### Parameters

**X** [array-like, shape=(batch\_size, n\_features)] Input batch matrix.

**Y** [array-like, shape=(n\_clusters, n\_features)] Matrix in which each row represents a centroid of a cluster.

#### Returns

**Z** [array-like, shape=(batch\_size, n\_clusters)] Pairwise dissimilarity matrix.

`dmae.dissimilarities.cosine(X, Y)`

Computes a pairwise cosine distance between two matrices  $\mathbf{D}_{ij} = (\mathbf{x}_i \cdot \mathbf{y}_j) / (\|\mathbf{x}_i\| \cdot \|\mathbf{y}_j\|)$ .

#### Parameters

**X** [array-like, shape=(batch\_size, n\_features)] Input batch matrix.

**Y** [array-like, shape=(n\_clusters, n\_features)] Matrix in which each row represents a centroid of a cluster.

#### Returns

**Z** [array-like, shape=(batch\_size, n\_clusters)] Pairwise dissimilarity matrix.

`dmae.dissimilarities.euclidean(X, Y)`

Computes a pairwise Euclidean distance between two matrices  $\mathbf{D}_{ij} = \|\mathbf{x}_i - \mathbf{y}_j\|$ .

#### Parameters

**X** [array-like, shape=(batch\_size, n\_features)] Input batch matrix.

**Y** [array-like, shape=(n\_clusters, n\_features)] Matrix in which each row represents a centroid of a cluster.

#### Returns

**Z** [array-like, shape=(batch\_size, n\_clusters)] Pairwise dissimilarity matrix.

```
dmae.dissimilarities.kullback_leibler(logit_P, logit_Q, eps=0.001, normalization='softmax_abs')  
Kullback Leibler divergence.  $\sum_x P_x \log P_x - P_x \log Q_x$ 
```

#### Parameters

**logit\_P** [array-like, shape=(batch\_size, n\_features)] Input batch matrix of logits.

**logit\_Q** [array-like, shape=(n\_features, n\_features)] Matrix in which each row represents the unsigned logit of a cluster.

**eps: float, default=1e-3** Hyperparameter to avoid numerical issues.

**normalization: {str, function}, default="softmax\_abs"** Specifies which normalization function is used to transform the data into probabilities. You can specify a custom function  $f(X, eps)$  with the arguments  $X$  and  $eps$ , or use a predefined function {"softmax\_abs", "softmax\_relu", "squared\_sum", "abs\_sum", "relu\_sum", "identity"}

#### Returns

**Z** [array-like, shape=(batch\_size, n\_clusters)] Pairwise dissimilarity matrix.

```
dmae.dissimilarities.mahalanobis(X, Y, cov)
```

Computes a pairwise Mahalanobis distance  $\mathbf{D}_{ij} = (\mathbf{x}_i - \mathbf{y}_j)^T \Sigma_j (\mathbf{x}_i - \mathbf{y}_j)$ .

#### Parameters

**X** [array-like, shape=(batch\_size, n\_features)] Input batch matrix.

**Y** [array-like, shape=(n\_features, n\_features)] Matrix in which each row represents a centroid of a cluster.

**cov: array-like, shape=(n\_clusters, n\_features, n\_features)** 3D Tensor with the inverse covariance matrices of all the clusters.

#### Returns

**Z** [array-like, shape=(batch\_size, n\_clusters)] Pairwise dissimilarity matrix.

```
dmae.dissimilarities.manhattan(X, Y)
```

Computes a pairwise Manhattan distance between two matrices  $\mathbf{D}_{ij} = \sum |\mathbf{x}_i| - |\mathbf{y}_j|$ .

#### Parameters

**X** [array-like, shape=(batch\_size, n\_features)] Input batch matrix.

**Y** [array-like, shape=(n\_clusters, n\_features)] Matrix in which each row represents a centroid of a cluster.

#### Returns

**Z** [array-like, shape=(batch\_size, n\_clusters)] Pairwise dissimilarity matrix.

```
dmae.dissimilarities.minkowsky(X, Y, p)
```

Computes a pairwise Minkowsky distance between two matrices  $\mathbf{D}_{ij} = (\sum |\mathbf{x}_i - \mathbf{y}_j|^p)^{1/p}$ .

#### Parameters

**X** [array-like, shape=(batch\_size, n\_features)] Input batch matrix.

**Y** [array-like, shape=(n\_clusters, n\_features)] Matrix in which each row represents a centroid of a cluster.

**p** [float] Order of the Minkowsky distance.

#### Returns

**Z** [array-like, shape=(batch\_size, n\_clusters)] Pairwise dissimilarity matrix.

```
dmae.dissimilarities.toroidal_euclidean(X, Y, interval=<tf.Tensor: shape=(2,), dtype=float32, numpy=array([2., 2.], dtype=float32)>)
```

Euclidean dissimilarity that considers circular boundaries.

#### Parameters

**X** [array-like, shape=(batch\_size, n\_features)] Input batch matrix.

**Y** [array-like, shape=(n\_features, n\_features)] Matrix in which each row represents a centroid of a cluster.

**interval** [array-like, default=tf.constant((2.0, 2.0))] Array representing the range on each axis.

#### Returns

**Z** [array-like, shape=(batch\_size, n\_clusters)] Pairwise dissimilarity matrix.

### 2.1.3 dmae.initializers module

The `dmae.initializers` module implements some initializers for DMAE.

```
class dmae.initializers.InitIdentityCov(X, n_clusters)
Bases: tensorflow.python.keras.initializers.initializers_v2.Initializer
A tf.keras initializer to assign identity matrices to the covariance parameters.
```

#### Parameters

**X: array-like, shape=(n\_samples, n\_features)** Input data.

**n\_clusters: int** Number of clusters.

#### Methods

<code>__call__(shape, dtype)</code>	Generates identity matrices for the given shape and type.
<code>from_config(config)</code>	Instantiates an initializer from a configuration dictionary.
<code>get_config()</code>	Returns the configuration of the initializer as a JSON-serializable dict.

```
class dmae.initializers.InitKMeans(kmeans_model)
Bases: tensorflow.python.keras.initializers.initializers_v2.Initializer
A tf.keras initializer to assign the clusters from a sklearn's KMeans model.
```

#### Parameters

**kmeans\_model: :mod:`sklearn.cluster.KMeans`** Pretrained KMeans model to initialize DMAE.

## Methods

<code>__call__(shape, dtype)</code>	Converts KMeans centroids into tensors.
<code>from_config(config)</code>	Instantiates an initializer from a configuration dictionary.
<code>get_config()</code>	Returns the configuration of the initializer as a JSON-serializable dict.

**class** `dmae.initializers.InitKMeansCov(kmeans_model, X, n_clusters)`

Bases: `tensorflow.python.keras.initializers.initializers_v2.Initializer`

A tf.keras initializer to compute covariance matrices from K-means.

### Parameters

**kmeans\_model:** :mod:`sklearn.cluster.KMeans` Pretrained KMeans model to initialize DMAE.

**X:** array-like, shape=(n\_samples, n\_features) Input data.

**n\_clusters:** int Number of clusters.

## Methods

<code>__call__(shape, dtype)</code>	Computes covariance matrices from the KMeans predictions.
<code>from_config(config)</code>	Instantiates an initializer from a configuration dictionary.
<code>get_config()</code>	Returns the configuration of the initializer as a JSON-serializable dict.

**class** `dmae.initializers.InitPlusPlus(X, n_clusters, dissimilarity=<function euclidean>, iters=100)`

Bases: `tensorflow.python.keras.initializers.initializers_v2.Initializer`

A tf.keras initializer based on K-Means++ that allows dissimilarities.

### Parameters

**X:** array-like, shape=(n\_samples, n\_features) Input data.

**n\_clusters:** int Number of clusters.

**dissimilarity:** function, default: :mod:`dmae.dissimilarities.euclidean` A tensorflow function that computes a pairwise dissimilarity function between a batch of points and the cluster's parameters.

**iters:** int, default: 100 Number of iterations to run the K-means++ initialization.

## Methods

<code>__call__(shape, dtype)</code>	Estimates <i>n_clusters</i> using K-means++
<code>from_config(config)</code>	Instantiates an initializer from a configuration dictionary.
<code>get_config()</code>	Returns the configuration of the initializer as a JSON-serializable dict.

## 2.1.4 dmae.layers module

The `dmae.layers` module implements the dissimilarity mixture autoencoder (DMAE) layers as tensorflow keras layers.

```
class dmae.layers.DissimilarityMixtureAutoencoder(*args, **kwargs)
Bases: tensorflow.python.keras.engine.base_layer.Layer
```

A tf.keras layer with the Dissimilarity Mixture Autoencoder (DMAE).

### Parameters

**alpha** [float] Softmax inverse temperature.

**n\_clusters** [int] Number of clusters.

**dissimilarity** [function, default = `dmae.dissimilarities.euclidean`] A tensorflow function that computes a pairwise dissimilarity function between a batch of points and the cluster's parameters.

**trainable** [dict, default = {"centers": True, "mixers": True}] Specifies which parameters are trainable.

**initializers** [dict, default = {"centers": RandomUniform(-1, 1), "mixers": Constant(1.0)}] Specifies a keras initializer (tf.keras.initializers) for each parameter.

**regularizers** [dict, default = {"centers": None, "mixers": None}] Specifies a keras regularizer (tf.keras.regularizers) for each parameter.

### Attributes

**activity\_regularizer** Optional regularizer function for the output of this layer.

**compute\_dtype** The dtype of the layer's computations.

**dtype** The dtype of the layer weights.

**dtype\_policy** The dtype policy associated with this layer.

**dynamic** Whether the layer is dynamic (eager-only); set in the constructor.

**inbound\_nodes** Deprecated, do NOT use! Only for compatibility with external Keras.

**input** Retrieves the input tensor(s) of a layer.

**input\_mask** Retrieves the input mask tensor(s) of a layer.

**input\_shape** Retrieves the input shape(s) of a layer.

**input\_spec** `InputSpec` instance(s) describing the input format for this layer.

**losses** List of losses added using the `add_loss()` API.

**metrics** List of metrics added using the `add_metric()` API.

**name** Name of the layer (string), set in the constructor.

**name\_scope** Returns a *tf.name\_scope* instance for this class.

**non\_trainable\_variables**

**non\_trainable\_weights** List of all non-trainable weights tracked by this layer.

**outbound\_nodes** Deprecated, do NOT use! Only for compatibility with external Keras.

**output** Retrieves the output tensor(s) of a layer.

**output\_mask** Retrieves the output mask tensor(s) of a layer.

**output\_shape** Retrieves the output shape(s) of a layer.

**stateful**

**submodules** Sequence of all sub-modules.

**supports\_masking** Whether this layer supports computing a mask using *compute\_mask*.

**trainable**

**trainable\_variables** Sequence of trainable variables owned by this module and its sub-modules.

**trainable\_weights** List of all trainable weights tracked by this layer.

**updates**

**variable\_dtype** Alias of *Layer.dtype*, the dtype of the weights.

**variables** Returns the list of all layer variables/weights.

**weights** Returns the list of all layer variables/weights.

## Methods

<code>__call__(*args, **kwargs)</code>	Wraps <i>call</i> , applying pre- and post-processing steps.
<code>add_loss(losses, **kwargs)</code>	Add loss tensor(s), potentially dependent on layer inputs.
<code>add_metric(value[, name])</code>	Adds metric tensor to the layer.
<code>add_update(updates[, inputs])</code>	Add update op(s), potentially dependent on layer inputs.
<code>add_variable(*args, **kwargs)</code>	Deprecated, do NOT use! Alias for <i>add_weight</i> .
<code>add_weight([name, shape, dtype, ...])</code>	Adds a new variable to the layer.
<code>apply(inputs, *args, **kwargs)</code>	Deprecated, do NOT use!
<code>build(input_shape)</code>	Builds the tensorflow variables.
<code>call(x)</code>	Forward pass in DMAE.
<code>compute_mask(inputs[, mask])</code>	Computes an output mask tensor.
<code>compute_output_shape(input_shape)</code>	Computes the output shape of the layer.
<code>compute_output_signature(input_signature)</code>	Compute the output tensor signature of the layer based on the inputs.
<code>count_params()</code>	Count the total number of scalars composing the weights.
<code>from_config(config)</code>	Creates a layer from its config.
<code>get_config()</code>	Returns the config of the layer.

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Table 5 – continued from previous page

<code>get_input_at(node_index)</code>	Retrieves the input tensor(s) of a layer at a given node.
<code>get_input_mask_at(node_index)</code>	Retrieves the input mask tensor(s) of a layer at a given node.
<code>get_input_shape_at(node_index)</code>	Retrieves the input shape(s) of a layer at a given node.
<code>get_losses_for(inputs)</code>	Deprecated, do NOT use!
<code>get_output_at(node_index)</code>	Retrieves the output tensor(s) of a layer at a given node.
<code>get_output_mask_at(node_index)</code>	Retrieves the output mask tensor(s) of a layer at a given node.
<code>get_output_shape_at(node_index)</code>	Retrieves the output shape(s) of a layer at a given node.
<code>get_updates_for(inputs)</code>	Deprecated, do NOT use!
<code>get_weights()</code>	Returns the current weights of the layer.
<code>set_weights(weights)</code>	Sets the weights of the layer, from Numpy arrays.
<code>with_name_scope(method)</code>	Decorator to automatically enter the module name scope.

**build** (*input\_shape*)

Builds the tensorflow variables.

**Parameters**

**input\_shape** [tuple] Input tensor shape.

**call** (*x*)

Forward pass in DMAE.

**Parameters**

**x** [array\_like] Input tensor.

**Returns**

**mu\_tilde** [array\_like] Soft-assigned centroids.

**pi\_tilde** [array\_like] Soft-assigned mixing coefficients.

**class** `dmae.layers.DissimilarityMixtureAutoencoderCov(*args, **kwargs)`

Bases: tensorflow.python.keras.engine.base\_layer.Layer

A `tf.keras` layer with the Dissimilarity Mixture Autoencoder (DMAE). This layer includes a covariance parameter for dissimilarities that allow it.

**Parameters**

**alpha** [float] Softmax inverse temperature.

**n\_clusters** [int] Number of clusters.

**dissimilarity** [function, default = `dmae.dissimilarities.mahalanobis`] A tensorflow function that computes a pairwise dissimilarity function between a batch of points and the cluster's parameters.

**trainable** [dict, default = {"centers": True, "cov": True, "mixers": True}] Specifies which parameters are trainable.

**initializers** [dict, default = {"centers": RandomUniform(-1, 1), "cov": RandomUniform(-1, 1)}]

**“mixers”**: `:mod:`Constant(1.0)`}` Specifies a keras initializer (`tf.keras.initializers`) for each parameter.

**regularizers** [dict, default = {"centers": None, "cov": None, "mixers": None}] Specifies a keras regularizer (`tf.keras.regularizers`) for each parameter.

## Attributes

**activity\_regularizer** Optional regularizer function for the output of this layer.

**compute\_dtype** The dtype of the layer’s computations.

**dtype** The dtype of the layer weights.

**dtype\_policy** The dtype policy associated with this layer.

**dynamic** Whether the layer is dynamic (eager-only); set in the constructor.

**inbound\_nodes** Deprecated, do NOT use! Only for compatibility with external Keras.

**input** Retrieves the input tensor(s) of a layer.

**input\_mask** Retrieves the input mask tensor(s) of a layer.

**input\_shape** Retrieves the input shape(s) of a layer.

**input\_spec** `InputSpec` instance(s) describing the input format for this layer.

**losses** List of losses added using the `add_loss()` API.

**metrics** List of metrics added using the `add_metric()` API.

**name** Name of the layer (string), set in the constructor.

**name\_scope** Returns a `tf.name_scope` instance for this class.

### non\_trainable\_variables

**non\_trainable\_weights** List of all non-trainable weights tracked by this layer.

**outbound\_nodes** Deprecated, do NOT use! Only for compatibility with external Keras.

**output** Retrieves the output tensor(s) of a layer.

**output\_mask** Retrieves the output mask tensor(s) of a layer.

**output\_shape** Retrieves the output shape(s) of a layer.

### stateful

**submodules** Sequence of all sub-modules.

**supports\_masking** Whether this layer supports computing a mask using `compute_mask`.

### trainable

**trainable\_variables** Sequence of trainable variables owned by this module and its sub-modules.

**trainable\_weights** List of all trainable weights tracked by this layer.

### updates

**variable\_dtype** Alias of `Layer.dtype`, the dtype of the weights.

**variables** Returns the list of all layer variables/weights.

**weights** Returns the list of all layer variables/weights.

## Methods

<code>__call__(*args, **kwargs)</code>	Wraps <i>call</i> , applying pre- and post-processing steps.
<code>add_loss(losses, **kwargs)</code>	Add loss tensor(s), potentially dependent on layer inputs.
<code>add_metric(value[, name])</code>	Adds metric tensor to the layer.
<code>add_update(updates[, inputs])</code>	Add update op(s), potentially dependent on layer inputs.
<code>add_variable(*args, **kwargs)</code>	Deprecated, do NOT use! Alias for <i>add_weight</i> .
<code>add_weight([name, shape, dtype, ...])</code>	Adds a new variable to the layer.
<code>apply(inputs, *args, **kwargs)</code>	Deprecated, do NOT use!
<code>build(input_shape)</code>	Builds the tensorflow variables.
<code>call(x)</code>	Forward pass in DMAE.
<code>compute_mask(inputs[, mask])</code>	Computes an output mask tensor.
<code>compute_output_shape(input_shape)</code>	Computes the output shape of the layer.
<code>compute_output_signature(input_signature)</code>	Compute the output tensor signature of the layer based on the inputs.
<code>count_params()</code>	Count the total number of scalars composing the weights.
<code>from_config(config)</code>	Creates a layer from its config.
<code>get_config()</code>	Returns the config of the layer.
<code>get_input_at(node_index)</code>	Retrieves the input tensor(s) of a layer at a given node.
<code>get_input_mask_at(node_index)</code>	Retrieves the input mask tensor(s) of a layer at a given node.
<code>get_input_shape_at(node_index)</code>	Retrieves the input shape(s) of a layer at a given node.
<code>get_losses_for(inputs)</code>	Deprecated, do NOT use!
<code>get_output_at(node_index)</code>	Retrieves the output tensor(s) of a layer at a given node.
<code>get_output_mask_at(node_index)</code>	Retrieves the output mask tensor(s) of a layer at a given node.
<code>get_output_shape_at(node_index)</code>	Retrieves the output shape(s) of a layer at a given node.
<code>get_updates_for(inputs)</code>	Deprecated, do NOT use!
<code>get_weights()</code>	Returns the current weights of the layer.
<code>set_weights(weights)</code>	Sets the weights of the layer, from Numpy arrays.
<code>with_name_scope(method)</code>	Decorator to automatically enter the module name scope.

**`build(input_shape)`**

Builds the tensorflow variables.

### Parameters

**`input_shape`** [tuple] Input tensor shape.

**`call(x)`**

Forward pass in DMAE.

### Parameters

**`x`** [array\_like] Input tensor.

### Returns

**mu\_tilde** [array\_like] Soft-assigned centroids.

**Cov\_hat** [array\_like] Soft-assigned covariance matrices.

**pi\_tilde** [array\_like] Soft-assigned mixing coefficients.

**class** dmae.layers.DissimilarityMixtureEncoder (\*args, \*\*kwargs)

Bases: tensorflow.python.keras.engine.base\_layer.Layer

A tf.keras layer that implements the dissimilarity mixture encoder (DM-Encoder). It computes the soft assignments using a dissimilarity function from `dmae.dissimilarities`.

### Parameters

**alpha** [float] Softmax inverse temperature.

**n\_clusters** [int] Number of clusters.

**dissimilarity** [function, default = `dmae.dissimilarities.euclidean`] A tensorflow function that computes a pairwise dissimilarity function between a batch of points and the cluster's parameters.

**trainable** [dict, default = {"centers": True, "mixers": True}] Specifies which parameters are trainable.

**initializers** [dict, default = {"centers": RandomUniform(-1, 1), "mixers": Constant(1.0)}] Specifies a keras initializer (tf.keras.initializers) for each parameter.

**regularizers** [dict, default = {"centers": None, "mixers": None}] Specifies a keras regularizer (tf.keras.regularizers) for each parameter.

### Attributes

**activity\_regularizer** Optional regularizer function for the output of this layer.

**compute\_dtype** The dtype of the layer's computations.

**dtype** The dtype of the layer weights.

**dtype\_policy** The dtype policy associated with this layer.

**dynamic** Whether the layer is dynamic (eager-only); set in the constructor.

**inbound\_nodes** Deprecated, do NOT use! Only for compatibility with external Keras.

**input** Retrieves the input tensor(s) of a layer.

**input\_mask** Retrieves the input mask tensor(s) of a layer.

**input\_shape** Retrieves the input shape(s) of a layer.

**input\_spec** `InputSpec` instance(s) describing the input format for this layer.

**losses** List of losses added using the `add_loss()` API.

**metrics** List of metrics added using the `add_metric()` API.

**name** Name of the layer (string), set in the constructor.

**name\_scope** Returns a `tf.name_scope` instance for this class.

**non\_trainable\_variables**

**non\_trainable\_weights** List of all non-trainable weights tracked by this layer.

**outbound\_nodes** Deprecated, do NOT use! Only for compatibility with external Keras.

**output** Retrieves the output tensor(s) of a layer.

**output\_mask** Retrieves the output mask tensor(s) of a layer.

**output\_shape** Retrieves the output shape(s) of a layer.

**stateful**

**submodules** Sequence of all sub-modules.

**supports\_masking** Whether this layer supports computing a mask using *compute\_mask*.

**trainable**

**trainable\_variables** Sequence of trainable variables owned by this module and its sub-modules.

**trainable\_weights** List of all trainable weights tracked by this layer.

**updates**

**variable\_dtype** Alias of *Layer.dtype*, the dtype of the weights.

**variables** Returns the list of all layer variables/weights.

**weights** Returns the list of all layer variables/weights.

## Methods

<code>__call__(*args, **kwargs)</code>	Wraps <i>call</i> , applying pre- and post-processing steps.
<code>add_loss(losses, **kwargs)</code>	Add loss tensor(s), potentially dependent on layer inputs.
<code>add_metric(value[, name])</code>	Adds metric tensor to the layer.
<code>add_update(updates[, inputs])</code>	Add update op(s), potentially dependent on layer inputs.
<code>add_variable(*args, **kwargs)</code>	Deprecated, do NOT use! Alias for <i>add_weight</i> .
<code>add_weight([name, shape, dtype, ...])</code>	Adds a new variable to the layer.
<code>apply(inputs, *args, **kwargs)</code>	Deprecated, do NOT use!
<code>build(input_shape)</code>	Builds the tensorflow variables.
<code>call(x)</code>	Forward pass in DM-Encoder.
<code>compute_mask(inputs[, mask])</code>	Computes an output mask tensor.
<code>compute_output_shape(input_shape)</code>	Computes the output shape of the layer.
<code>compute_output_signature(input_signature)</code>	Compute the output tensor signature of the layer based on the inputs.
<code>count_params()</code>	Count the total number of scalars composing the weights.
<code>from_config(config)</code>	Creates a layer from its config.
<code>get_config()</code>	Returns the config of the layer.
<code>get_input_at(node_index)</code>	Retrieves the input tensor(s) of a layer at a given node.
<code>get_input_mask_at(node_index)</code>	Retrieves the input mask tensor(s) of a layer at a given node.
<code>get_input_shape_at(node_index)</code>	Retrieves the input shape(s) of a layer at a given node.
<code>get_losses_for(inputs)</code>	Deprecated, do NOT use!
<code>get_output_at(node_index)</code>	Retrieves the output tensor(s) of a layer at a given node.

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Table 7 – continued from previous page

get_output_mask_at(node_index)	Retrieves the output mask tensor(s) of a layer at a given node.
get_output_shape_at(node_index)	Retrieves the output shape(s) of a layer at a given node.
get_updates_for(inputs)	Deprecated, do NOT use!
get_weights()	Returns the current weights of the layer.
set_weights(weights)	Sets the weights of the layer, from Numpy arrays.
with_name_scope(method)	Decorator to automatically enter the module name scope.

**build**(*input\_shape*)  
Builds the tensorflow variables.

#### Parameters

**input\_shape** [tuple] Input tensor shape.

**call**(*x*)  
Forward pass in DM-Encoder.

#### Parameters

**x** [array\_like] Input tensor.

#### Returns

**S** [array\_like] Soft assignments.

**class** dmae.layers.DissimilarityMixtureEncoderCov(\*args, \*\*kwargs)  
Bases: tensorflow.python.keras.engine.base\_layer.Layer

A tf.keras layer that implements the dissimilarity mixture encoder (DM-Encoder). It computes the soft assignments using a dissimilarity function from *dmae.dissimilarities*. This layer includes a covariance parameter for dissimilarities that allow it.

#### Parameters

**alpha** [float] Softmax inverse temperature.

**n\_clusters** [int] Number of clusters.

**dissimilarity** [function, default = *dmae.dissimilarities.mahalanobis*] A tensorflow function that computes a pairwise dissimilarity function between a batch of points and the cluster's parameters.

**trainable** [dict, default = {"centers": True, "cov": True, "mixers": True}] Specifies which parameters are trainable.

**initializers** [dict, default = {"centers": RandomUniform(-1, 1), "cov": RandomUniform(-1, 1)}]

**"mixers": :mod:`Constant(1.0)`}** Specifies a keras initializer (tf.keras.initializers) for each parameter.

**regularizers** [dict, default = {"centers": None, "cov": None, "mixers": None}] Specifies a keras regularizer (tf.keras.regularizers) for each parameter.

#### Attributes

**activity\_regularizer** Optional regularizer function for the output of this layer.

**compute\_dtype** The dtype of the layer's computations.

**dtype** The dtype of the layer weights.

**dtype\_policy** The dtype policy associated with this layer.

**dynamic** Whether the layer is dynamic (eager-only); set in the constructor.

**inbound\_nodes** Deprecated, do NOT use! Only for compatibility with external Keras.

**input** Retrieves the input tensor(s) of a layer.

**input\_mask** Retrieves the input mask tensor(s) of a layer.

**input\_shape** Retrieves the input shape(s) of a layer.

**input\_spec** *InputSpec* instance(s) describing the input format for this layer.

**losses** List of losses added using the *add\_loss()* API.

**metrics** List of metrics added using the *add\_metric()* API.

**name** Name of the layer (string), set in the constructor.

**name\_scope** Returns a *tf.name\_scope* instance for this class.

**non\_trainable\_variables**

**non\_trainable\_weights** List of all non-trainable weights tracked by this layer.

**outbound\_nodes** Deprecated, do NOT use! Only for compatibility with external Keras.

**output** Retrieves the output tensor(s) of a layer.

**output\_mask** Retrieves the output mask tensor(s) of a layer.

**output\_shape** Retrieves the output shape(s) of a layer.

**stateful**

**submodules** Sequence of all sub-modules.

**supports\_masking** Whether this layer supports computing a mask using *compute\_mask*.

**trainable**

**trainable\_variables** Sequence of trainable variables owned by this module and its sub-modules.

**trainable\_weights** List of all trainable weights tracked by this layer.

**updates**

**variable\_dtype** Alias of *Layer.dtype*, the dtype of the weights.

**variables** Returns the list of all layer variables/weights.

**weights** Returns the list of all layer variables/weights.

## Methods

<code>__call__(*args, **kwargs)</code>	Wraps <i>call</i> , applying pre- and post-processing steps.
<code>add_loss(losses, **kwargs)</code>	Add loss tensor(s), potentially dependent on layer inputs.
<code>add_metric(value[, name])</code>	Adds metric tensor to the layer.
<code>add_update(updates[, inputs])</code>	Add update op(s), potentially dependent on layer inputs.
<code>add_variable(*args, **kwargs)</code>	Deprecated, do NOT use! Alias for <i>add_weight</i> .
<code>add_weight([name, shape, dtype, ...])</code>	Adds a new variable to the layer.
<code>apply(inputs, *args, **kwargs)</code>	Deprecated, do NOT use!
<code>build(input_shape)</code>	Builds the tensorflow variables.
<code>call(x)</code>	Forward pass in DM-Encoder.
<code>compute_mask(inputs[, mask])</code>	Computes an output mask tensor.
<code>compute_output_shape(input_shape)</code>	Computes the output shape of the layer.
<code>compute_output_signature(input_signature)</code>	Compute the output tensor signature of the layer based on the inputs.
<code>count_params()</code>	Count the total number of scalars composing the weights.
<code>from_config(config)</code>	Creates a layer from its config.
<code>get_config()</code>	Returns the config of the layer.
<code>get_input_at(node_index)</code>	Retrieves the input tensor(s) of a layer at a given node.
<code>get_input_mask_at(node_index)</code>	Retrieves the input mask tensor(s) of a layer at a given node.
<code>get_input_shape_at(node_index)</code>	Retrieves the input shape(s) of a layer at a given node.
<code>get_losses_for(inputs)</code>	Deprecated, do NOT use!
<code>get_output_at(node_index)</code>	Retrieves the output tensor(s) of a layer at a given node.
<code>get_output_mask_at(node_index)</code>	Retrieves the output mask tensor(s) of a layer at a given node.
<code>get_output_shape_at(node_index)</code>	Retrieves the output shape(s) of a layer at a given node.
<code>get_updates_for(inputs)</code>	Deprecated, do NOT use!
<code>get_weights()</code>	Returns the current weights of the layer.
<code>set_weights(weights)</code>	Sets the weights of the layer, from Numpy arrays.
<code>with_name_scope(method)</code>	Decorator to automatically enter the module name scope.

**`build(input_shape)`**

Builds the tensorflow variables.

### Parameters

**`input_shape`** [tuple] Input tensor shape.

**`call(x)`**

Forward pass in DM-Encoder.

### Parameters

**`x`** [array\_like] Input tensor.

### Returns

**S** [array\_like] Soft assignments.

## 2.1.5 dmae.losses module

The `dmae.losses` module implements several loss functions for each dissimilarity in `dmae.dissimilarities`.

`dmae.losses.chebyshev_loss (X, mu_tilde, pi_tilde, alpha)`

Computes the Chebyshev loss.

### Parameters

**X: array-like, shape=(batch\_size, n\_features)** Input batch matrix.

**mu\_tilde: array-like, shape=(batch\_size, n\_features)** Matrix in which each row represents the assigned mean vector.

**pi\_tilde: array-like, shape=(batch\_size, )** Vector in which each element represents the assigned mixing coefficient.

**alpha: float** Softmax inverse temperature.

### Returns

**loss: float** Computed loss for each sample.

`dmae.losses.cosine_loss (X, mu_tilde, pi_tilde, alpha)`

Computes the cosine loss.

### Parameters

**X: array-like, shape=(batch\_size, n\_features)** Input batch matrix.

**mu\_tilde: array-like, shape=(batch\_size, n\_features)** Matrix in which each row represents the assigned mean vector.

**pi\_tilde: array-like, shape=(batch\_size, )** Vector in which each element represents the assigned mixing coefficient.

**alpha: float** Softmax inverse temperature.

### Returns

**loss: array-like, shape=(batch\_size, )** Computed loss for each sample.

`dmae.losses.euclidean_loss (X, mu_tilde, pi_tilde, alpha)`

Computes the Euclidean loss.

### Parameters

**X: array-like, shape=(batch\_size, n\_features)** Input batch matrix.

**mu\_tilde: array-like, shape=(batch\_size, n\_features)** Matrix in which each row represents the assigned mean vector.

**pi\_tilde: array-like, shape=(batch\_size, )** Vector in which each element represents the assigned mixing coefficient.

**alpha: float** Softmax inverse temperature.

### Returns

**loss: array-like, shape=(batch\_size, )** Computed loss for each sample.

dmae.losses.kullback\_leibler\_loss (*logit\_P*, *logit\_Q\_tilde*, *pi\_tilde*, *alpha*, *eps*=0.001, *normalization*='softmax\_abs')

Loss for the Kullback Leibler divergence.

#### Parameters

**logit\_P:** array-like, shape=(batch\_size, n\_features) Input batch logits (pre-normalization values).

**logit\_Q\_tilde:** array-like, shape=(batch\_size, n\_features) Cluster logits (pre-normalization values)

**pi\_tilde:** array-like, shape=(batch\_size,) Vector in which each element represents the assigned mixing coefficient.

**alpha:** float Softmax inverse temperature.

**normalization:** {str, function}, default="softmax\_abs" Specifies which normalization function is used to transform the data into probabilities. You can specify a custom function  $f(X, \epsilon)$  with the arguments  $X$  and  $\epsilon$ , or use a predefined function {"softmax\_abs", "softmax\_relu", "squared\_sum", "abs\_sum", "relu\_sum", "identity"}

#### Returns

**loss:** float Computed loss for each batch.

dmae.losses.mahalanobis\_loss (*X*, *mu\_tilde*, *Cov\_tilde*, *pi\_tilde*, *alpha*)

Computes the Mahalanobis loss.

#### Parameters

**X:** array-like, shape=(batch\_size, n\_features) Input batch matrix.

**mu\_tilde:** array-like, shape=(batch\_size, n\_features) Matrix in which each row represents the assigned mean vector.

**Cov\_tilde:** array-like, shape=(batch\_size, n\_features, n\_features) Tensor with the assigned covariances.

**pi\_tilde:** array-like, shape=(batch\_size,) Vector in which each element represents the assigned mixing coefficient.

**alpha:** float Softmax inverse temperature.

#### Returns

**loss:** array-like, shape=(batch\_size,) Computed loss for each sample.

dmae.losses.manhattan\_loss (*X*, *mu\_tilde*, *pi\_tilde*, *alpha*)

Computes the Manhattan loss.

#### Parameters

**X:** array-like, shape=(batch\_size, n\_features) Input batch matrix.

**mu\_tilde:** array-like, shape=(batch\_size, n\_features) Matrix in which each row represents the assigned mean vector.

**pi\_tilde:** array-like, shape=(batch\_size,) Vector in which each element represents the assigned mixing coefficient.

**alpha:** float Softmax inverse temperature.

#### Returns

**loss:** array-like, shape=(batch\_size,) Computed loss for each sample.

---

```
dmae.losses.minkowsky_loss (X, mu_tilde, pi_tilde, alpha, p)
```

Computes the Minkowsky loss.

#### Parameters

**X: array-like, shape=(batch\_size, n\_features)** Input batch matrix.

**mu\_tilde: array-like, shape=(batch\_size, n\_features)** Matrix in which each row represents the assigned mean vector.

**pi\_tilde: array-like, shape=(batch\_size, )** Vector in which each element represents the assigned mixing coefficient.

**alpha: float** Softmax inverse temperature.

**p: float** Order of the Minkowsky distance

#### Returns

**loss: array-like, shape=(batch\_size, )** Computed loss for each sample.

```
dmae.losses.toroidal_euclidean_loss (X, mu_tilde, pi_tilde, alpha, interval=<tf.Tensor:  
shape=(2,), dtype=float32, numpy=array([2., 2.],  
dtype=float32)>)
```

Loss for the toroidal euclidean dissimilarity.

#### Parameters

**X: array-like, shape=(batch\_size, n\_features)** Input batch matrix.

**mu\_tilde: array-like, shape=(batch\_size, n\_features)** Matrix in which each row represents the assigned mean vector.

**pi\_tilde: array-like, shape=(batch\_size, )** Vector in which each element represents the assigned mixing coefficient.

**alpha: float** Softmax inverse temperature.

**interval** [array-like, default=tf.constant((2.0, 2.0))] Array representing the range on each axis.

#### Returns

**loss: float** Computed loss for each batch.

### 2.1.6 dmae.metrics module

The `dmae.metrics` module implements some evaluation metrics that are used in the paper.

```
dmae.metrics.unsupervised_classification_accuracy (y_true, y_pred)
```

Scipy-based implementation of the unsupervised classification accuracy.

#### Parameters

**y\_true: array-like, shape=(n\_samples, )** Array with the Ground truth labels.

**y\_pred: array-like, shape=(n\_samples, )** Array with the predicted labels.

#### Returns

**uacc: float** Unsupervised classification accuracy between y\_true and y\_pred.

```
dmae.metrics.zero_norm (preds, thr=1e-07)
```

Numpy implementation of the L0 norm.

#### Parameters

**preds:** array-like, shape=(n\_samples, n\_clusters) Soft-assignments extracted from a DM-Encoder

**thr:** float Threshold used to compute the L0 norm.

**Returns**

**L0:** float L0 norm of the soft-assignments.

## 2.1.7 Module contents

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