SLAYER PyTorch

Release 0.1

Sumit Bam Shrestha

CONTENTS:

1	SLAYER PyTorch main	1
2	SLAYER module	3
3	Spike Classifier	7
4	Spike Loss	9
5	Spike Input/Output	11
6	Learning statistics	17
7	Indices and tables 7.1 Usage:	
Рy	thon Module Index	23
In	dex	25

CHAPTER

ONE

SLAYER PYTORCH MAIN

This modules bundles various SLAYER PyTorch modules as a single package. The complete module can be imported as

>>> import slayerSNN as snn

- The spike-layer module will be available as snn.layer.
- The yaml-parameter module will be availabe as snn.params.
- The **spike-loss** module will be available as snn.loss.
- The **spike-classifier** module will be available as snn.predict.
- The **spike-IO** module will be available as snn.io.

SLAYER MODULE

class slayer.spikeLayer (neuronDesc, simulationDesc, fullRefKernel=False)

This class defines the main engine of SLAYER. It provides necessary functions for describing a SNN layer. The input to output connection can be fully-connected, convolutional, or aggregation (pool) It also defines the psp operation and spiking mechanism of a spiking neuron in the layer.

Important: It assumes all the tensors that are being processed are 5 dimensional. (Batch, Channels, Height, Width, Time) or NCHWT format. The user must make sure that an input of correct dimension is supplied.

If the layer does not have spatial dimension, the neurons can be distributed along either Channel, Height or Width dimension where Channel * Height * Width is equal to number of neurons. It is recommended (for speed reasons) to define the neurons in Channels dimension and make Height and Width dimension one.

Arguments:

• neuronDesc (slayer.yamlParams): spiking neuron descriptor.

```
neuron:
             SRMALPHA # neuron type
   type:
   theta:
            10 # neuron threshold
   tauSr:
            10.0
                     # neuron time constant
   tauRef: 1.0
                     # neuron refractory time constant
   scaleRef: 2
                     # neuron refractory response scaling (relative
→to theta)
                      # spike function derivative time constant.
   tauRho:
           1
→ (relative to theta)
                      # spike function derivative scale factor
   scaleRho: 1
```

• simulationDesc (slayer.yamlParams): simulation descriptor

```
simulation:
Ts: 1.0
tSample: 300
nSample: 12
```

• fullRefKernel (bool, optional): high resolution refractory kernel (the user shall not use it in practice)

Usage:

```
>>> snnLayer = slayer.spikeLayer(neuronDesc, simulationDesc)
```

Returns a function that can be called to apply conv layer mapping to input tensor per time instance. It behaves same as torch.nn.conv2d applied for each time instance.

Arguments:

- inChannels (int): number of channels in input
- outChannels (int): number of channls produced by convoluion
- kernelSize (int or tuple of two ints): size of the convolving kernel
- stride (int or tuple of two ints): stride of the convolution. Default: 1
- padding (int or tuple of two ints): zero-padding added to both sides of the input. Default: 0
- dilation (int or tuple of two ints): spacing between kernel elements. Default: 1
- groups (int or tuple of two ints): number of blocked connections from input channels to output channels. Default: 1

The parameters kernelSize, stride, padding, dilation can either be:

- a single int in which case the same value is used for the height and width dimension
- a tuple of two ints in which case, the first *int* is used for the height dimension, and the second *int* for the width dimension

Usage:

```
>>> conv = snnLayer.conv(2, 32, 5) # 32C5 flter
>>> output = conv(input) # must have 2 channels
```

delay (inputSize)

Returns a function that can be called to apply delay opeartion in time dimension of the input tensor. The delay parameter is available as delay.delay and is initialized uniformly between 0ms and 1ms. The delay parameter is stored as float values, however, it is floored during actual delay application internally. The delay values are not clamped to zero. To maintain the causality of the network, one should clamp the delay values explicitly to ensure positive delays.

Arguments:

• inputSize (int or tuple of three ints): spatial shape of the input signal in CHW format (Channel, Height, Width). If integer value is supplied, it refers to the number of neurons in channel dimension. Heighe and Width are assumed to be 1.

Usage:

```
>>> delay = snnLayer.delay((C, H, W))
>>> delayedSingal = delay(input)
```

Always clamp the delay after optimizer.step().

```
>>> optimizer.step()
>>> delay.delay.data.clamp_(0)
```

dense (inFeatures, outFeatures, weightScale=10)

Retuns a function that can be called to apply dense layer mapping to input tensor per time instance. It behaves similar to torch.nn.Linear applied for each time instance.

Arguments:

- inFeatures (int, tuple of two ints, tuple of three ints): dimension of input features (Width, Height, Channel) that represents the number of input neurons.
- outFeatures (int): number of output neurons.

dropout (p=0.5, inplace=False)

Returns a function that can be called to apply dropout layer to the input tensor. It behaves similar to torch.nn.Dropout. However, dropout over time dimension is preserved, i.e. if a neuron is dropped, it remains dropped for entire time duration.

Arguments:

- p: dropout probability.
- inplace (bool): inplace opeartion flag.

Usage:

```
>>> drop = snnLayer.dropout(0.2)
>>> output = drop(input)
```

pool (kernelSize, stride=None, padding=0, dilation=1)

Returns a function that can be called to apply pool layer mapping to input tensor per time instance. It behaves same as torch.nn.:sum pooling applied for each time instance.

Arguments:

- kernelSize (int or tuple of two ints): the size of the window to pool over
- stride (int or tuple of two ints): stride of the window. Default: kernelSize
- padding (int or tuple of two ints): implicit zero padding to be added on both sides. Default: 0
- dilation (int or tuple of two ints): a parameter that controls the stride of elements in the window. Default: 1

The parameters kernelSize, stride, padding, dilation can either be:

- a single int in which case the same value is used for the height and width dimension
- a tuple of two ints in which case, the first *int* is used for the height dimension, and the second *int* for the width dimension

Usage:

```
>>> pool = snnLayer.pool(4) # 4x4 pooling
>>> output = pool(input)
```

psp(spike)

Applies psp filtering to spikes. The output tensor dimension is same as input.

Arguments:

• spike: input spike tensor.

Usage:

```
>>> filteredSpike = snnLayer.psp(spike)
```

spike (membranePotential)

Applies spike function and refractory response. The output tensor dimension is same as input. membranePotential will reflect spike and refractory behaviour as well.

Arguments:

• membranePotential: subthreshold membrane potential.

Usage:

```
>>> outSpike = snnLayer.spike(membranePotential)
```

class slayer.yamlParams(parameter_file_path)

This class reads yaml parameter file and allows dictionary like access to the members.

CHAPTER

THREE

SPIKE CLASSIFIER

class spikeClassifier.spikeClassifier

It provides classification modules for SNNs. All the functions it supplies are static and can be called without making an instance of the class.

static getClass(spike)

Returns the predicted class label. It assignes single class for the SNN output for the whole simulation runtime.

Usage:

>>> predictedClass = spikeClassifier.getClass(spikeOut)

FOUR

SPIKE LOSS

class spikeLoss.**spikeLoss** (*networkDescriptor*, *slayerClass*=<*class* '*slayer.spikeLayer*'>)

This class defines different spike based loss modules that can be used to optimize the SNN.

Usage:

```
>>> error = spikeLoss.spikeLoss(networkDescriptor)
>>> error = spikeLoss.spikeLoss(errorDescriptor, neuronDesc, simulationDesc)
```

numSpikes (spikeOut, desiredClass, numSpikesScale=1)

Calculates spike loss based on number of spikes within a *target region*. The *target region* and *desired spike count* is specified in error.errorDescriptor['tgtSpikeRegion'] Any spikes outside the target region are penalized with error.spikeTime loss..

$$e(t) = \begin{cases} \frac{acutalSpikeCount-desiredSpikeCount}{targetRegionLength} & \text{for } t \in targetRegion\\ \left(\varepsilon*(output-desired)\right)(t) & \text{otherwise} \end{cases}$$

$$E = \int_{0}^{T} e(t)^{2} \mathrm{d}t$$

Arguments:

- spikeOut (torch.tensor): spike tensor
- desiredClass (torch.tensor): one-hot encoded desired class tensor. Time dimension should be 1 and rest of the tensor dimensions should be same as spikeOut.

Usage:

```
>>> loss = error.numSpikes(spikeOut, target)
```

spikeTime (spikeOut, spikeDesired)

Calculates spike loss based on spike time. The loss is similar to van Rossum distance between output and desired spike train.

$$E = \int_{0}^{T} \left(\varepsilon * (output - desired)\right)(t)^{2} dt$$

Arguments:

- spikeOut (torch.tensor): spike tensor
- spikeDesired (torch.tensor): desired spike tensor

>>> loss = error.spikeTime(spikeOut, spikeDes)

FIVE

SPIKE INPUT/OUTPUT

spikeFileIO.encode1DnumSpikes (filename, nID, tSt, tEn, nSp)

Writes binary spike file given a tuple specifying neuron, start of spike region, end of spike region and number of spikes.

The binary file is encoded as follows:

- Number of spikes data is represented by an 80 bit number
- First 16 bits (bits 79-64) represent the neuronID
- Next 24 bits (bits 63-40) represents the start time in microseconds
- Next 24 bits (bits 39-16) represents the end time in microseconds
- Last 16 bits (bits 15-0) represents the number of spikes

Arguments:

- filename (string): path to the binary file
- nID (numpy array): neuron ID
- tSt (numpy array): region start time (in milliseconds)
- tEn (numpy array): region end time (in milliseconds)
- nSp (numpy array): number of spikes in the region

Usage:

```
>>> spikeFileIO.encode1DnumSpikes(file_path, nID, tSt, tEn, nSp)
```

spikeFileIO.encode1Dspikes (filename, TD)

Writes one dimensional binary spike file from a TD event.

The binary file is encoded as follows:

- Each spike event is represented by a 40 bit number.
- First 16 bits (bits 39-24) represent the neuronID.
- Bit 23 represents the sign of spike event: 0=>OFF event, 1=>ON event.
- the last 23 bits (bits 22-0) represent the spike event timestamp in microseconds.

Arguments:

- filename (string): path to the binary file.
- TD (an spikeFileIO.event): TD event.

```
>>> spikeFileIO.write1Dspikes(file_path, TD)
```

spikeFileIO.encode2Dspikes (filename, TD)

Writes two dimensional binary spike file from a TD event. It is the same format used in neuromorphic datasets NMNIST & NCALTECH101.

The binary file is encoded as follows:

- Each spike event is represented by a 40 bit number.
- First 8 bits (bits 39-32) represent the xID of the neuron.
- Next 8 bits (bits 31-24) represent the yID of the neuron.
- Bit 23 represents the sign of spike event: 0=>OFF event, 1=>ON event.
- The last 23 bits (bits 22-0) represent the spike event timestamp in microseconds.

Arguments:

- filename (string): path to the binary file.
- TD (an spikeFileIO.event): TD event.

Usage:

```
>>> spikeFileIO.write2Dspikes(file_path, TD)
```

spikeFileIO.encode3Dspikes (filename, TD)

Writes binary spike file for TD event in height, width and channel dimension.

The binary file is encoded as follows:

- Each spike event is represented by a 56 bit number.
- First 12 bits (bits 56-44) represent the xID of the neuron.
- Next 12 bits (bits 43-32) represent the yID of the neuron.
- Next 8 bits (bits 31-24) represents the channel ID of the neuron.
- The last 24 bits (bits 23-0) represent the spike event timestamp in microseconds.

Arguments:

- filename (string): path to the binary file.
- TD (an spikeFileIO.event): TD event.

Usage:

```
>>> spikeFileIO.write3Dspikes(file_path, TD)
```

class spikeFileIO.event (xEvent, yEvent, pEvent, tEvent)

This class provides a way to store, read, write and visualize spike event.

Members:

- x (numpy int array): x index of spike event.
- y (numpy int array): y index of spike event (not used if the spatial dimension is 1).
- p (numpy int array): polarity or channel index of spike event.
- t (numpy double array): timestamp of spike event. Time is assumend to be in ms.

```
>>> TD = spikeFileIO.event(xEvent, yEvent, pEvent, tEvent)
```

toSpikeArray (samplingTime=1, dim=None)

Returns a numpy tensor that contains the spike events sampled in bins of *samplingTime*. The array is of dimension (channels, height, time) or "CHT" for 1D data. The array is of dimension (channels, height, width, time) or "CHWT" for 2D data.

Arguments:

- samplingTime: the width of time bin to use.
- dim: the dimension of the desired tensor. Assignes dimension itself if not provided.

Usage:

```
>>> spike = TD.toSpikeArray()
```

toSpikeTensor (emptyTensor, samplingTime=1)

Returns a numpy tensor that contains the spike events sampled in bins of *samplingTime*. The tensor is of dimension (channels, height, width, time) or 'CHWT'.

Arguments:

- emptyTensor (numpy or torch tensor): an empty tensor to hold spike data
- samplingTime: the width of time bin to use.

Usage:

```
>>> spike = TD.toSpikeTensor( torch.zeros((2, 240, 180, 5000)) )
```

spikeFileIO.read1DnumSpikes (filename)

Reads a tuple specifying neuron, start of spike region, end of spike region and number of spikes from binary spike file.

The binary file is encoded as follows:

- Number of spikes data is represented by an 80 bit number.
- First 16 bits (bits 79-64) represent the neuronID.
- Next 24 bits (bits 63-40) represents the start time in microseconds.
- Next 24 bits (bits 39-16) represents the end time in microseconds.
- Last 16 bits (bits 15-0) represents the number of spikes.

Arguments:

• filename (string): path to the binary file

Usage:

```
>>> nID, tSt, tEn, nSp = spikeFileIO.read1DnumSpikes(file_path)
``tSt`` and ``tEn`` are returned in milliseconds
```

spikeFileIO.read1Dspikes (filename)

Reads one dimensional binary spike file and returns a TD event.

The binary file is encoded as follows:

- Each spike event is represented by a 40 bit number.
- First 16 bits (bits 39-24) represent the neuronID.

- Bit 23 represents the sign of spike event: 0=>OFF event, 1=>ON event.
- the last 23 bits (bits 22-0) represent the spike event timestamp in microseconds.

Arguments:

• filename (string): path to the binary file.

Usage:

```
>>> TD = spikeFileIO.read1Dspikes(file_path)
```

spikeFileIO.read2Dspikes (filename)

Reads two dimensional binary spike file and returns a TD event. It is the same format used in neuromorphic datasets NMNIST & NCALTECH101.

The binary file is encoded as follows:

- Each spike event is represented by a 40 bit number.
- First 8 bits (bits 39-32) represent the xID of the neuron.
- Next 8 bits (bits 31-24) represent the yID of the neuron.
- Bit 23 represents the sign of spike event: 0=>OFF event, 1=>ON event.
- The last 23 bits (bits 22-0) represent the spike event timestamp in microseconds.

Arguments:

• filename (string): path to the binary file.

Usage:

```
>>> TD = spikeFileIO.read2Dspikes(file_path)
```

spikeFileIO.read3Dspikes (filename)

Reads binary spike file for spike event in height, width and channel dimension and returns a TD event.

The binary file is encoded as follows:

- Each spike event is represented by a 56 bit number.
- First 12 bits (bits 56-44) represent the xID of the neuron.
- Next 12 bits (bits 43-32) represent the yID of the neuron.
- Next 8 bits (bits 31-24) represents the channel ID of the neuron.
- The last 24 bits (bits 23-0) represent the spike event timestamp in microseconds.

Arguments:

• filename (string): path to the binary file.

Usage:

```
>>> TD = spikeFileIO.read3Dspikes(file_path)
```

spikeFileIO.showTD (TD, frameRate=24, preComputeFrames=True, repeat=False)

Visualizes TD event.

Arguments:

- TD: spike event to visualize.
- frameRate: framerate of visualization.

- preComputeFrames: flag to enable precomputation of frames for faster visualization. Default is True.
- repeat: flag to enable repeat of animation. Default is False.

Usage:

>>> showTD(TD)

spikeFileIO.spikeArrayToEvent (spikeMat, samplingTime=1)

Returns TD event from a numpy array (of dimension 3 or 4). The numpy array must be of dimension (channels, height, time) or "CHT" for 1D data. The numpy array must be of dimension (channels, height, width, time) or "CHWT" for 2D data.

Arguments:

- spikeMat: numpy array with spike information.
- samplingTime: time width of each time bin.

Usage:

>>> TD = spikeFileIO.spikeArrayToEvent(spike)

LEARNING STATISTICS

class learningStats.learningStat

This class collect the learning statistics over the epoch.

Usage:

This class is designed to be used with learningStats instance although it can be used separately.

```
>>> trainingStat = learningStat()
```

accuracy()

Returns the average accuracy calculated from the point the stats was reset.

Usage:

```
>>> loss = trainingStat.accuracy()
```

loss()

Returns the average loss calculated from the point the stats was reset.

Usage:

```
>>> loss = trainingStat.loss()
```

reset()

Reset the learning staistics. This should usually be done before the start of an epoch so that new statistics counts can be accumulated.

Usage:

```
>>> trainingStat.reset()
```

update()

Updates the stats of the current session and resets the measures for next session.

Usage:

```
>>> trainingStat.update()
```

class learningStats.learningStats

This class provides mechanism to collect learning stats for training and testing, and displaying them efficiently.

Usage:

```
stats = learningStats()
```

(continues on next page)

(continued from previous page)

```
for epoch in range(100):
       tSt = datetime.now()
       stats.training.reset()
       for i in trainingLoop:
                # other main stuffs
               stats.training.correctSamples += numberOfCorrectClassification
                \verb|stats.training.numSamples| += | numberOfSamplesProcessed|
                stats.training.lossSum += currentLoss
                stats.print(epoch, i, (datetime.now() - tSt).total_seconds())
       stats.training.update()
       stats.testing.reset()
       for i in testingLoop
                # other main stuffs
               stats.testing.correctSamples += numberOfCorrectClassification
               stats.testing.numSamples += numberOfSamplesProcessed
                stats.testing.lossSum
                                            += currentLoss
               stats.print(epoch, i)
       stats.training.update()
```

plot (figures=(1, 2), saveFig=False)

Plots the available learning statistics.

Arguments:

- figures: Index of figure ID to plot on. Default is figure(1) for loss plot and figure(2) for accuracy plot.
- saveFig`` (``bool): flag to save figure into a file.

Usage:

```
# plot stats
stats.plot()

# plot stats figures specified
stats.print(figures=(10, 11))
```

print (epoch, iter=None, timeElapsed=None)

Prints the available learning statistics from the current session on the console. For Linux systems, prints the data on same terminal space (might not work properly on other systems).

Arguments:

- epoch: epoch counter to display (required).
- iter: iteration counter to display (not required).
- timeElapsed: runtime information (not required).

Usage:

```
# prints stats with epoch index provided
stats.print(epoch)

# prints stats with epoch index and iteration index provided
stats.print(epoch, iter=i)
```

(continues on next page)

(continued from previous page)

```
save (filename=")
```

Saves the learning satatistics logs.

Arguments:

• filename: filename to save the logs. accuracy.txt and loss.txt will be appended

Usage:

update()

Updates the stats for training and testing and resets the measures for next session.

```
>>> stats.update()
```

CHAPTER

SEVEN

INDICES AND TABLES

- · genindex
- · modindex
- · search

7.1 Usage:

```
>>> import slayerSNN as snn
```

- The spike-layer module will be available as snn.layer.
- The yaml-parameter module will be availabe as snn.params.
- The spike-loss module will be available as snn.loss.
- The spike-classifier module will be available as snn.predict.
- The **spike-IO** module will be available as snn.io.

7.2 Example:

The SNN parameters are stored in a yaml file. The structure of the yaml file follows the same hierarchy as the C++ SLAYER framework (see Network Description)

```
import slayerSNN as snn
   # other imports and definitions
   class Network(torch.nn.Module):
      def __init__(self, netParams, device=device):
         super(Network, self).__init__()
6
         # initialize slayer
         slayer = snn.layer(netParams['neuron'], netParams['simulation'], device=device)
         self.sl = slayer
         # define network functions
10
         self.conv1 = slayer.conv(2, 16, 5, padding=1)
11
         self.conv2 = slayer.conv(16, 32, 3, padding=1)
12
         self.conv3 = slayer.conv(32, 64, 3, padding=1)
13
         self.pool1 = slayer.pool(2)
         self.pool2 = slayer.pool(2)
         self.fc1
                   = slayer.dense((8, 8, 64), 10)
```

(continues on next page)

(continued from previous page)

```
17
      def forward(self, spikeInput):
18
         spikeLayer1 = self.sl.spike(self.conv1(self.sl.psp(spikeInput))) # 32, 32, 16
19
         spikeLayer2 = self.sl.spike(self.pool1(self.sl.psp(spikeLayer1))) # 16, 16, 16
20
         spikeLayer3 = self.sl.spike(self.conv2(self.sl.psp(spikeLayer2))) # 16, 16, 32
21
         spikeLayer4 = self.sl.spike(self.pool2(self.sl.psp(spikeLayer3))) # 8,
22
         spikeLayer5 = self.sl.spike(self.conv3(self.sl.psp(spikeLayer4))) # 8,
23
         spikeOut
                     = self.sl.spike(self.fc1 (self.sl.psp(spikeLayer5))) #
24
         return spikeOut
25
26
27
   # network
   net = Network(snn.params('path to yaml file'))
28
   # cost function
30
   error = snn.loss(netParams)
31
32
   # dataloader not shown. input and target are assumed to be available
33
   output = net.forward(input)
34
   loss = error.numSpikes(output, target)
```

Important: It is assumed that all the tensors that are being processed are 5 dimensional. (Batch, Channels, Height, Width, Time) or NCHWT format. The user must make sure that an input of correct dimension is supplied.

If the layer does not have spatial dimension, the neurons can be distributed along either Channel, Height or Width dimension where Channel * Height * Width is equal to number of neurons. It is recommended (for speed reasons) to define the neurons in Channels dimension and make Height and Width dimension one.

PYTHON MODULE INDEX

learningStats, 17

S
slayer, 3
slayerSNN, 1
spikeClassifier, 7
spikeFileIO, 11
spikeLoss, 9

24 Python Module Index

INDEX

A	read3Dspikes() (in module spikeFileIO), 14 reset() (learningStats.learningStat method), 17		
accuracy() (learningStats.learningStat method), 17	S		
C	save() (learningStats.learningStats method), 19		
conv() (slayer.spikeLayer method), 3	showTD() (in module spikeFileIO), 14		
D	slayer (module), 3 slayerSNN (module), 1		
delay() (slayer.spikeLayer method), 4 dense() (slayer.spikeLayer method), 4	spike() (slayer.spikeLayer method), 5		
dropout () (slayer.spikeLayer method), 5	<pre>spikeArrayToEvent() (in module spikeFileIO), 15 spikeClassifier (class in spikeClassifier), 7</pre>		
E	spikeClassifier (module),7		
encode1DnumSpikes() (in module spikeFileIO), 11	spikeFileIO (module), 11 spikeLayer (class in slayer), 3		
encode1Dspikes() (in module spikeFileIO), 11 encode2Dspikes() (in module spikeFileIO), 12	spikeLoss (class in spikeLoss), 9		
encode3Dspikes() (in module spikeFileIO), 12	<pre>spikeLoss (module), 9 spikeTime() (spikeLoss.spikeLoss method), 9</pre>		
event (class in spikeFileIO), 12	T		
	toSpikeArray() (spikeFileIO.event method), 13		
<pre>getClass() (spikeClassifier.spikeClassifier static method), 7</pre>	toSpikeTensor() (spikeFileIO.event method), 13		
L	U		
learningStat (class in learningStats), 17 learningStats (class in learningStats), 17	update() (learningStats.learningStat method), 17 update() (learningStats.learningStats method), 19		
learningStats (module), 17	Υ		
loss() (learningStats.learningStat method), 17	yamlParams (class in slayer), 6		
N			
numSpikes() (spikeLoss.spikeLoss method), 9			
P			
plot() (learningStats.learningStats method), 18 pool() (slayer.spikeLayer method), 5 print() (learningStats.learningStats method), 18 psp() (slayer.spikeLayer method), 5			
R			
read1DnumSpikes() (in module spikeFileIO), 13 read1Dspikes() (in module spikeFileIO), 13 read2Dspikes() (in module spikeFileIO), 14			