TensorFlow API r1.4

# tf.contrib.layers.batch\_norm

```
batch_norm(
    inputs,
    decay=0.999,
    center=True,
    scale=False,
    epsilon=0.001,
    activation_fn=None,
   param_initializers=None,
    param_regularizers=None,
    updates_collections=tf.GraphKeys.UPDATE_OPS,
    is_training=True,
    reuse=None,
    variables_collections=None,
    outputs_collections=None,
    trainable=True,
    batch_weights=None,
    fused=None,
    data_format=DATA_FORMAT_NHWC,
   zero_debias_moving_mean=False,
    scope=None,
    renorm=False,
    renorm_clipping=None,
    renorm_decay=0.99
```

Defined in tensorflow/contrib/layers/python/layers/layers.py.

See the guide: Layers (contrib) > Higher level ops for building neural network layers

Adds a Batch Normalization layer from http://arxiv.org/abs/1502.03167.

"Batch Normalization: Accelerating Deep Network Training by Reducing Internal Covariate Shift"

Sergey Ioffe, Christian Szegedy

Can be used as a normalizer function for conv2d and fully\_connected.



Note: when training, the moving\_mean and moving\_variance need to be updated. By default the update ops are placed in tf.GraphKeys.UPDATE\_OPS, so they need to be added as a dependency to the train\_op. For example:

```
update_ops = tf.get_collection(tf.GraphKeys.UPDATE_OPS)
with tf.control_dependencies(update_ops):
  train_op = optimizer.minimize(loss)
```

One can set updates\_collections=None to force the updates in place, but that can have a speed penalty, especially in distributed settings.

### Args:

• inputs: A tensor with 2 or more dimensions, where the first dimension has batch\_size. The normalization is over all but the last dimension if data\_format is NHWC and the second dimension if data\_format is NCHW.

- decay: Decay for the moving average. Reasonable values for decay are close to 1.0, typically in the multiple-nines range: 0.999, 0.99, 0.9, etc. Lower decay value (recommend trying decay =0.9) if model experiences reasonably good training performance but poor validation and/or test performance. Try zero\_debias\_moving\_mean=True for improved stability.
- center: If True, add offset of beta to normalized tensor. If False, beta is ignored.
- scale: If True, multiply by gamma. If False, gamma is not used. When the next layer is linear (also e.g. nn.relu), this can be disabled since the scaling can be done by the next layer.
- epsilon: Small float added to variance to avoid dividing by zero.
- activation\_fn: Activation function, default set to None to skip it and maintain a linear activation.
- param\_initializers: Optional initializers for beta, gamma, moving mean and moving variance.
- param\_regularizers: Optional regularizer for beta and gamma.
- updates\_collections: Collections to collect the update ops for computation. The updates\_ops need to be executed with the train\_op. If None, a control dependency would be added to make sure the updates are computed in place.
- is\_training: Whether or not the layer is in training mode. In training mode it would accumulate the statistics of the moments into moving\_mean and moving\_variance using an exponential moving average with the given decay.

  When it is not in training mode then it would use the values of the moving\_mean and the moving\_variance.
- reuse: Whether or not the layer and its variables should be reused. To be able to reuse the layer scope must be given.
- variables\_collections: Optional collections for the variables.
- outputs\_collections : Collections to add the outputs.
- trainable: If True also add variables to the graph collection GraphKeys.TRAINABLE\_VARIABLES (see tf.Variable).
- batch\_weights: An optional tensor of shape [batch\_size], containing a frequency weight for each batch item. If
  present, then the batch normalization uses weighted mean and variance. (This can be used to correct for bias in
  training example selection.)
- fused: if True, use a faster, fused implementation if possible. If None, use the system recommended implementation.
- data\_format: A string. NHWC (default) and NCHW are supported.
- zero\_debias\_moving\_mean: Use zero\_debias for moving\_mean. It creates a new pair of variables 'moving\_mean/biased' and 'moving\_mean/local\_step'.
- scope: Optional scope for variable\_scope.
- renorm: Whether to use Batch Renormalization (https://arxiv.org/abs/1702.03275). This adds extra variables during training. The inference is the same for either value of this parameter.
- renorm\_clipping: A dictionary that may map keys 'rmax', 'rmin', 'dmax' to scalar Tensors used to clip the renorm correction. The correction (r, d) is used as corrected\_value = normalized\_value \* r + d, with r clipped to [rmin, rmax], and d to [-dmax, dmax]. Missing rmax, rmin, dmax are set to inf, 0, inf, respectively.
- renorm\_decay: Momentum used to update the moving means and standard deviations with renorm. Unlike
   momentum, this affects training and should be neither too small (which would add noise) nor too large (which would
   give stale estimates). Note that decay is still applied to get the means and variances for inference.

## Returns:

A **Tensor** representing the output of the operation.

#### Raises:

• ValueError: If data\_format is neither NHWC nor NCHW.

- ValueError: If the rank of **inputs** is undefined.
- ValueError: If rank or channels dimension of **inputs** is undefined.

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