### HW3 Assignment

- In matlab (or python if you prefer), write forward and backprop functions for each of the following convnet building blocks:
  - ReLu, maxpool, meanpool, FC (fully connect), and softmax
- Note: I will be providing forward and backprop functions for convolution, in matlab, as examples/guides.
- Note: do not call out to any functions from matconvnet or pytorch or other convnet libraries. You are expected to write the functions from scratch yourself.
- Adhere strictly to the function names and argument order given in the homework description. Our definitions are simplified from the more general functions implemented in 3<sup>rd</sup> party libraries.
  Also, I will be testing your functions by calling them with test data!

Function y = forw\_relu(x)
input x is an mxn matrix
output y is an mxn matrix

$$y_{ij} = \max(0, x_{ij})$$

Function dzdx = back\_relu(x,y,dzdy)
 input x is an mxn matrix
 input y is an mxn matrix (output from forward pass)
 input dzdy is an mxn matrix of dz/dy<sub>ij</sub> values
 output dzdx is an mxn matrix of dz/dx<sub>ii</sub> values

- Function y = forw\_maxpool(x)
   input x is an 2mx2n matrix (that is, you may assume that it has an even number of rows and cols)
   output y is an mxn matrix
- Function dzdx = back\_maxpool(x,y,dzdy)
   input x is an 2mx2n matrix
   input y is an mxn matrix (output from forward pass)
   input dzdy is an mxn matrix of dz/dy<sub>ij</sub> values
   output dzdx is an 2mx2n matrix of dz/dx<sub>ij</sub> values

- Function y = forw\_meanpool(x)
   input x is an 2mx2n matrix (that is, you may assume that it has an even number of rows and cols)
   output y is an mxn matrix
- Function dzdx = back\_meanpool(x,y,dzdy)
   input x is an 2mx2n matrix
   input y is an mxn matrix (output from forward pass)
   input dzdy is an mxn matrix of dz/dy<sub>ij</sub> values
   output dzdx is an 2mx2n matrix of dz/dx<sub>ij</sub> values

 Function y = forw\_fc(x,w,b) %fully connect input x is an mxn matrix input w is an mxn matrix of weights b is a scalar bias value output y is a scalar value

$$y = \sum_{i} \sum_{j} w_{ij} x_{ij} + b$$

Function [dzdx,dzdw,dzdb] = back\_fc(x,w,b,y,dzdy)
 input x is an mxn matrix
 input w is an mxn matrix of weights
 b is a scalar bias value
 input y is a scalar value (output from forward pass)
 input dzdy is a scalar value dx/dy
 output dzdx is an mxn matrix of dz/dx<sub>ij</sub> values
 output dzdw is an mxn matrix of dz/dw<sub>ij</sub> values
 output dzdb is a value dz/db

Function y = forw\_softmax(x)
input x is mx1 vector
output y is an mx1 vector

$$y_i = \frac{e^{x_i}}{\sum_j e^{x_j}}$$

Function dzdx = back\_softmax (x,y,dzdy)
 input x is an mx1 vector
 input y is an mx1 vector (output from forward pass)
 input dzdy is an mx1 vector of dz/dy; values
 output dzdx is an mx1 vector of dz/dx; values

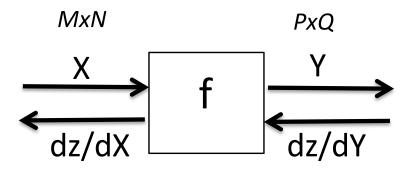
# Assignment Part 2

 Test that your backprop functions work by estimating the derivatives numerically using forw\_xyz, and comparing those to the values returned from your back\_xyz function (see next page for more details).

• I won't be trying to run this section of code, just show me that it works by attaching the output of running it.

## Assignment Part 2

• More specifically, for numerical derivative testing, refer to the picture below, from our backprop lecture.



- To compute dz/dX numerically:
  - make up some values for forward pass input X
  - also make up some values for backprop input dz/dY
  - compute output values Y using the forw\_xyz function you wrote
  - we now want to compute dz/dX numerically
    - for each input value Xij, make a small change Xij+eps, run your forw\_xyz function to see how it changes Y values, estimate the numerical derivatives dY/dXij, then combine appropriately with your made up dz/dY values to compute dz/dXij. Repeat for all Xij.
  - compare the numerically estimated dz/dX values with the analytic ones you compute in the back\_xyz function you wrote. They should be the same (or very similar)
  - Refer to testbackconv.m on our assignment page for an example estimating numeric derivs for dz/dX, dz/dw, and dz/db of the convolution function.

#### What to Hand In

In the assignment dropbox on Canvas, upload a single zip file that contains your forward, backward, and numerical derivative test routines, the output of running the derivative tests, and an optional readme file if you need to tell me something.

#### What I'm looking for when grading

- forw and back routines submitted for relu, maxpool, meanpool, FC, and softmax
- each routine works correctly when I test it
- code is commented and has good formatting
- did not just call some external library routine
- routines for numerical gradient checking are submitted. These could be in one big file if you want, I'm not going to be calling them.
- showing output of running the numerical gradient tests