

Loss was generated taking negative logs of sigmoid and softmax functions.  
Gradients were generated by multiplying other word vectors with (values - 1) where values are output of softmax/sigmoid functions. For centre word, outside word vectors were multiplied while for outside words, centre word vectors was multiplied.

Sigmoid function-

```
def sigmoid(x):  
    s = 1 / (1 + np.exp(-x))  
    return s
```

Naive softmax loss and gradient-

```
def naiveSoftmaxLossAndGradient(centerWordVec, outsideWordIdx, outsideVectors, dataset):  
    matrix = np.matmul(outsideVectors, centerWordVec)  
    probability = softmax(matrix)  
    loss = -np.log(probability[outsideWordIdx])  
    values = probability.copy()  
    values[outsideWordIdx] = values[outsideWordIdx] - 1  
    gradCenterVec = np.matmul(outsideVectors.T, values)  
    gradOutsideVecs = np.outer(values, centerWordVec)  
    return loss, gradCenterVec, gradOutsideVecs
```

Negative sample loss and gradient-

```
def negSamplingLossAndGradient(centerWordVec, outsideWordIdx, outsideVectors, dataset,  
K=10):  
    negSampleWordIndices = getNegativeSamples(outsideWordIdx, dataset, K)  
    indices = [outsideWordIdx] + negSampleWordIndices  
    # zero gradients and losses  
    gradCenterVec = np.zeros(centerWordVec.shape)  
    gradOutsideVecs = np.zeros(outsideVectors.shape)  
    loss = 0.0  
    u_o = outsideVectors[outsideWordIdx]  
    z = sigmoid(np.dot(u_o, centerWordVec))  
    loss -= np.log(z)  
    gradCenterVec += u_o*(z-1)  
    gradOutsideVecs[outsideWordIdx] = centerWordVec*(z-1)  
    return loss, gradCenterVec, gradOutsideVecs
```

Skipgram-

```
def skipgram(currentCenterWord, windowSize, outsideWords, word2Ind, centerWordVectors,  
outsideVectors, dataset, word2vecLossAndGradient=naiveSoftmaxLossAndGradient):  
    loss = 0.0  
    gradCenterVecs = np.zeros(centerWordVectors.shape)  
    gradOutsideVectors = np.zeros(outsideVectors.shape)  
    center_id = word2Ind[currentCenterWord]  
    centerWordVec = centerWordVectors[center_id]  
    for word in outsideWords:  
        outside_id = word2Ind[word]  
        loss_mini, gradCenter_mini, gradOutside_mini=  
word2vecLossAndGradient(centerWordVec=centerWordVec,  
outsideWordIdx=outside_id, outsideVectors=outsideVectors, dataset=dataset)  
        loss += loss_mini  
        gradCenterVecs[center_id] += gradCenter_mini  
        gradOutsideVectors += gradOutside_mini  
    return loss, gradCenterVecs, gradOutsideVectors
```