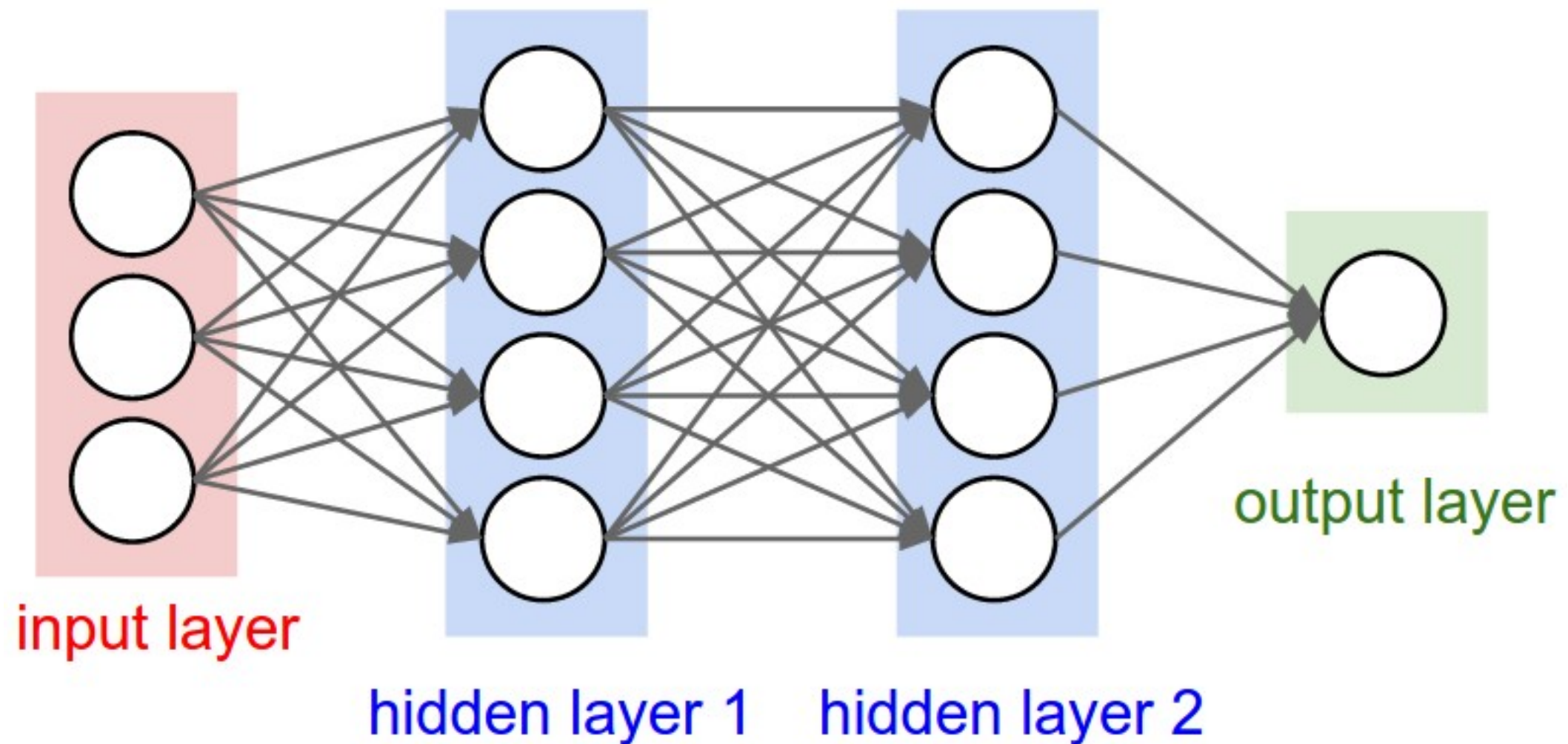


Neural Networks

Working with Keras

Term : Dense Layer

- Also known as fully connected layer
- All the nodes in this layer are connected to all other nodes in the previous layer



Term : Optimizers

- Optimizers are the algorithms which reduce the loss
- eg. Gradient Descent
- There are many others
 - Adam Optimizer
 - Momentum
 - Nesterov
 - SGD (Stochastic Gradient Descent)
- Details about [each of them is here](#)

Term : Loss

- Represent the loss function which we use for our problem
- Can be of different type for different problems
 - For **regression** - [mean_squared_error](#)
 - For **classification** - ??
- List of loss [function is available here](#)

Keras : Steps

1. Specify Architecture
 1. Layers
 2. Activation Functions
2. Compile
 1. Specify loss and optimizers
3. Fit
 1. Train the data and calculate loss
 2. Optimize
4. Predict

Keras : Architecture

```
1 # Import necessary modules
2 import keras
3 from keras.layers import Dense
4 from keras.models import Sequential
5
6 # Save the number of columns in predictors: n_cols
7 n_cols = predictors.shape[1]
8
9 # Set up the model: model
10 model = Sequential()
11
12 # Add the first layer
13 model.add(Dense(50, activation='relu', input_shape=(n_cols,)))
14
15 # Add the second layer
16 model.add(Dense(32, activation='relu'))
17
18 # Add the output layer
19 model.add(Dense(1))
20
```

Nodes

Input shape

Layer 1

Activation

Layer 2

Output Layer

Keras : Compile

Optimizer

Loss Function

```
1 # Compile the model
2 model.compile(optimizer='adam', loss='mean_squared_error')
3
4 # Verify that model contains information | from compiling
5 print("Loss function: " + model.loss)
```

Loss function: mean_squared_error

Keras : Fit the model

```
: 1 # Fit the model  
2 model.fit(predictors,target)
```

Training the model

Epoch 1/10 ← Number of iterations
534/534 [=====] - 0s - loss: 187.4750
Epoch 2/10
534/534 [=====] - 0s - loss: 35.5615
Epoch 3/10
534/534 [=====] - 0s - loss: 27.6003
Epoch 4/10
534/534 [=====] - 0s - loss: 23.8839
Epoch 5/10
534/534 [=====] - 0s - loss: 22.9858
Epoch 6/10
534/534 [=====] - 0s - loss: 22.5383
Epoch 7/10
534/534 [=====] - 0s - loss: 22.1515
Epoch 8/10

Loss

Keras : Classification

Things have changed now

Points to think about

- How many nodes in the output?
- How do we know which class is which?
- Do we need to prepare the data?
- Loss function ? - MSE will not work now.

Keras : Classification

```
1 # Specify, compile, and fit the model
2 model = Sequential()
3 model.add(Dense(32, activation='relu', input_shape = (n_cols,)))
4 model.add(Dense(2, activation='softmax'))
5 model.compile(optimizer='sgd',
6               loss='categorical_crossentropy',
7               metrics=['accuracy'])
8 model.fit(predictors, target)
9
10 # Calculate predictions: predictions
11 predictions = model.predict(pred_data)
12
13 # Calculate predicted probability of survival: predicted_prob_true
14 predicted_prob_true = predictions[:,1]
15
16 # print predicted_prob_true
17 print(predicted_prob_true)
```

Softmax

Loss function changed

Predictions