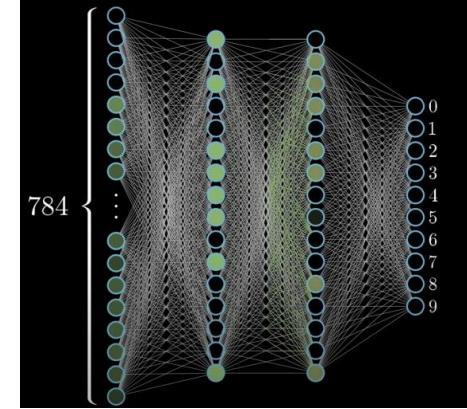


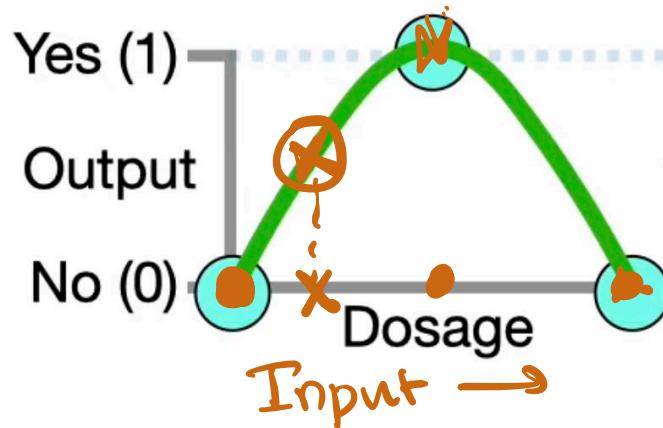
Link to handout: <https://bit.ly/NN-DFS-Backprop>

PA03: TRAINING NEURAL NETWORKS USING



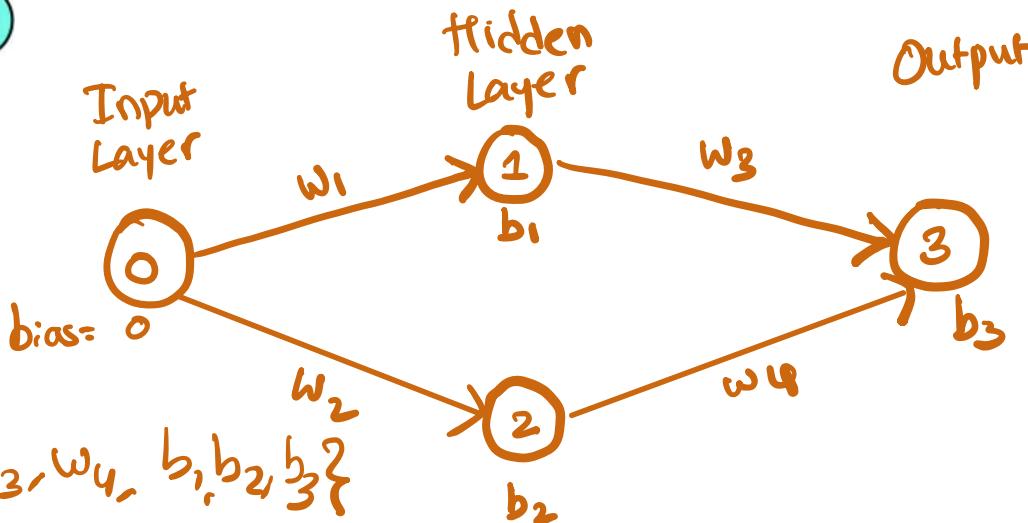
DFS-BASED BACKPROPAGATION

Neural Net to predict effectiveness of a drug



Draw the neural network that was used to predict whether a drug's dosage is effective against a virus.

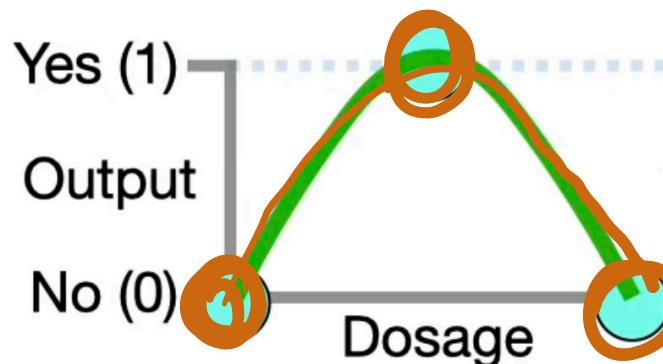
How many parameters does the NN have?



7

parameters = $\{w_1, w_2, w_3, w_4, b_1, b_2, b_3\}$

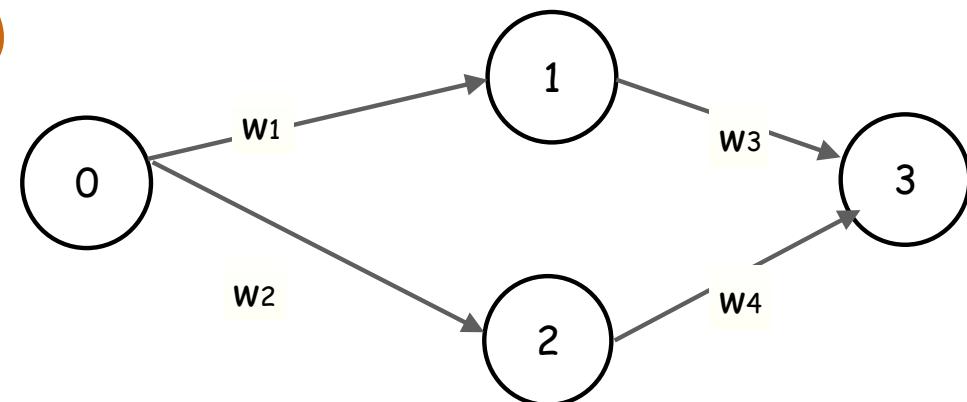
What is “training” the neural net?



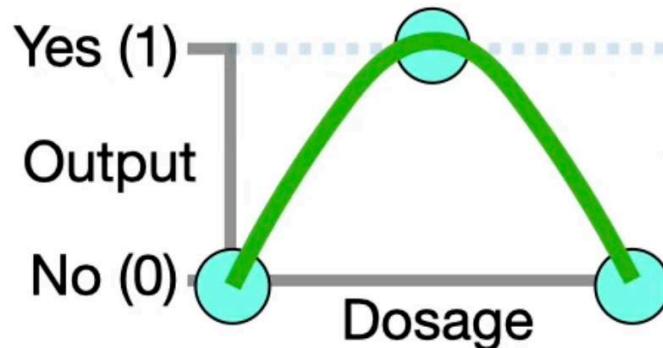
Training a neural net means adjusting its parameters (weights and biases) so it learns to map inputs to the correct outputs.

Show the neural net different example inputs and outputs

Training Inputs	Output (y)	Predict (P)
0	0	P_1
0.5	1	P_2
1	0	P_3



Backpropagation = smart feedback



Backprop: Guiding feedback that tells each weight and bias how to slightly nudge to reduce the error.

In PA03, that feedback is abstracted into a call to contribute(node, y, p)

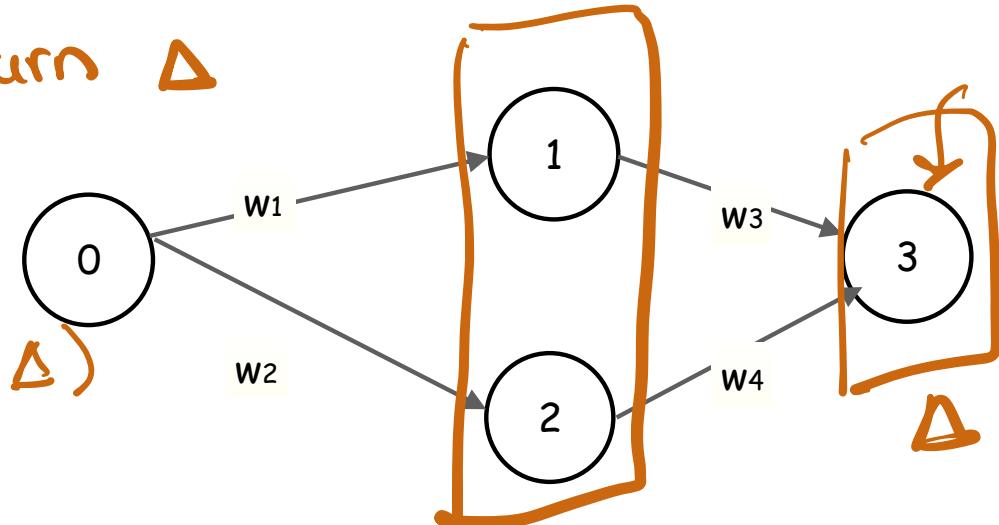
nudge = contribution

contribute(3, y, p) return Δ

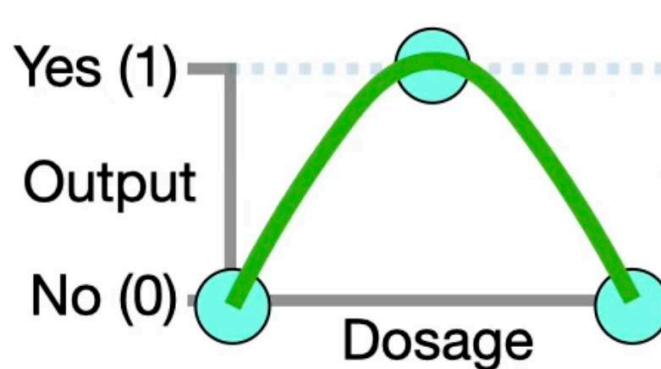
Outgoing contribution $\rightarrow \Delta = 0$

// Base case
Computes Δ

Apply Δ to the
nodes bias
 \rightarrow VISIT Contribute Node(3, Δ)
Store Δ in a lookup table
return Δ



Backpropagation: PA03 contribute()

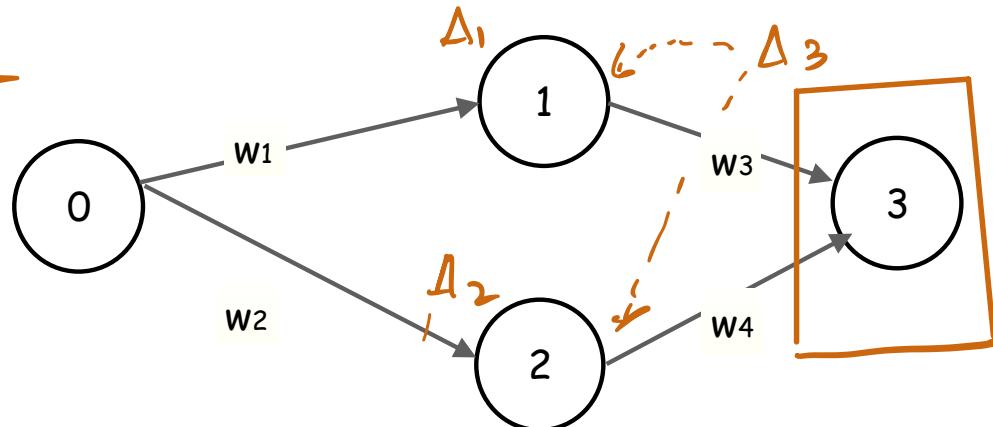


Node 3's contribution = Nudge to node 3's bias

Contributions in one layer are used to compute the contributions in the previous layer

Node 3's outgoing contribution is used to compute the contributions of which nodes? *Nodes 1 and 2*

Δ_3 is used to compute Δ_1 & Δ_2



Backpropagation: Order of operations for one node

Goal:
Compute Δ for node 0

contribute(0, y, p):

$$\Delta = 0$$

$$\Delta_1 = C(1)$$

$$VCNb(c_1, \Delta_1, \Delta)$$

$$\Delta_2 = C(2)$$

$$VCNb(c_2, \Delta_2, \Delta)$$

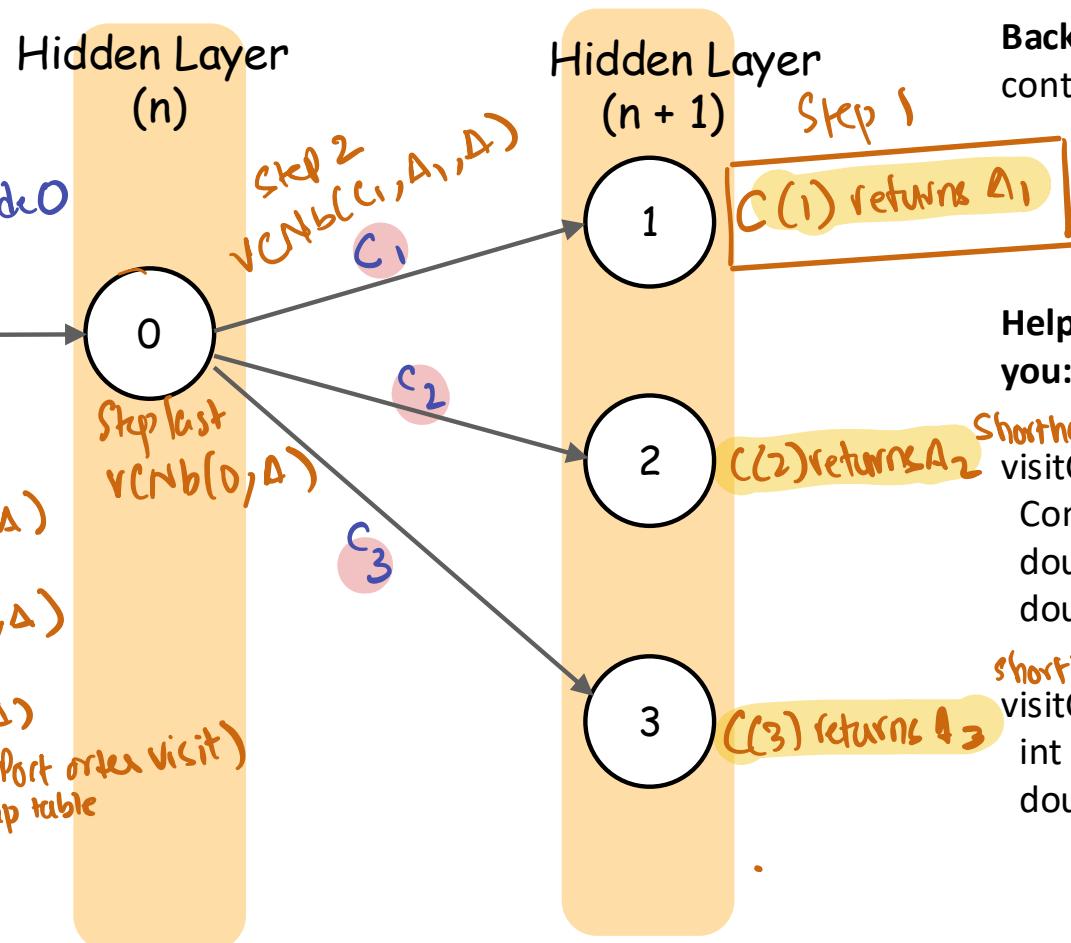
$$\Delta_3 = C(3)$$

$$VCNb(c_3, \Delta_3, \Delta)$$

$$VCN(0, \Delta)$$

(Post order visit)
Store Δ in lookup table

return Δ



Backprop using DFS (you need to implement)
contribute(int nodeId,
const double& y,
const double& p)

Short hand
 $C(nodeId)$

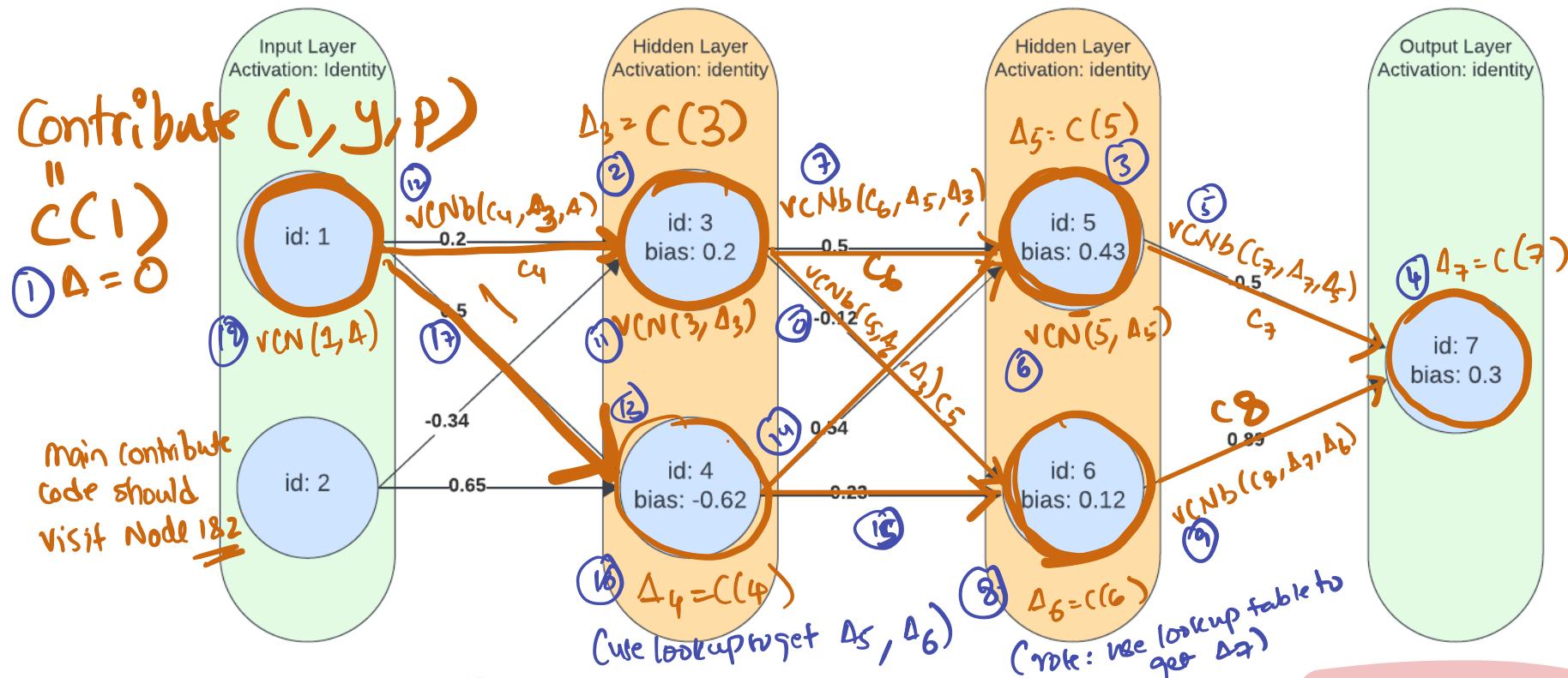
Helper visit functions that do the math for you:

Shorthand: $VCNb$ (connection, Δ_{in} , Δ_{out})
visitContributeNeighbor(

Connection& c,
double& incomingContribution,
double& outgoingContribution)

Shorthand: VCN (nodeId, Δ)
visitContributeNode(
int vId,
double& outgoingContribution)

Activity: Trace Data Flow for Backpropagation (contribute)



Trace the order in which **contribute(...)**, **visitContributeNode(...)**, and **visitContributeNeighbor(...)** are called. For each node, write down: when it's visited, what contributions it receives, and when those are passed on to others.