

# Artificial Neural Networks (ANN)

## Basics

Similar in Structure to Collections of Neurons in Brain

Operate Faster than Biological Counterparts but with less Parallelism

Their Novel Architecture can result in more Elegant Solutions to some Problems

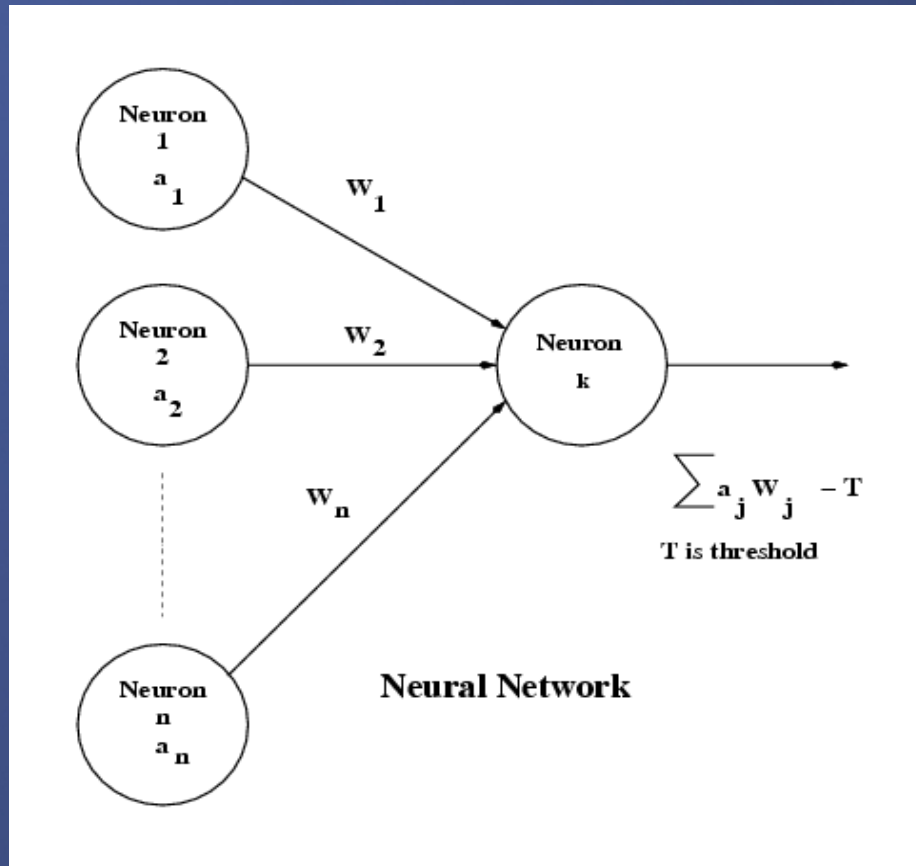
# ANN's

## General Types of ANN's

Supervised	An Input Vector and the Correct Answer are Provided
Unsupervised	Only Inputs are Provided
Feed Forward	No Feedback
Recurrent	Output Neurons Connected to Input Neurons

# ANN's

## Simple Feed Forward ANN (Most Common)

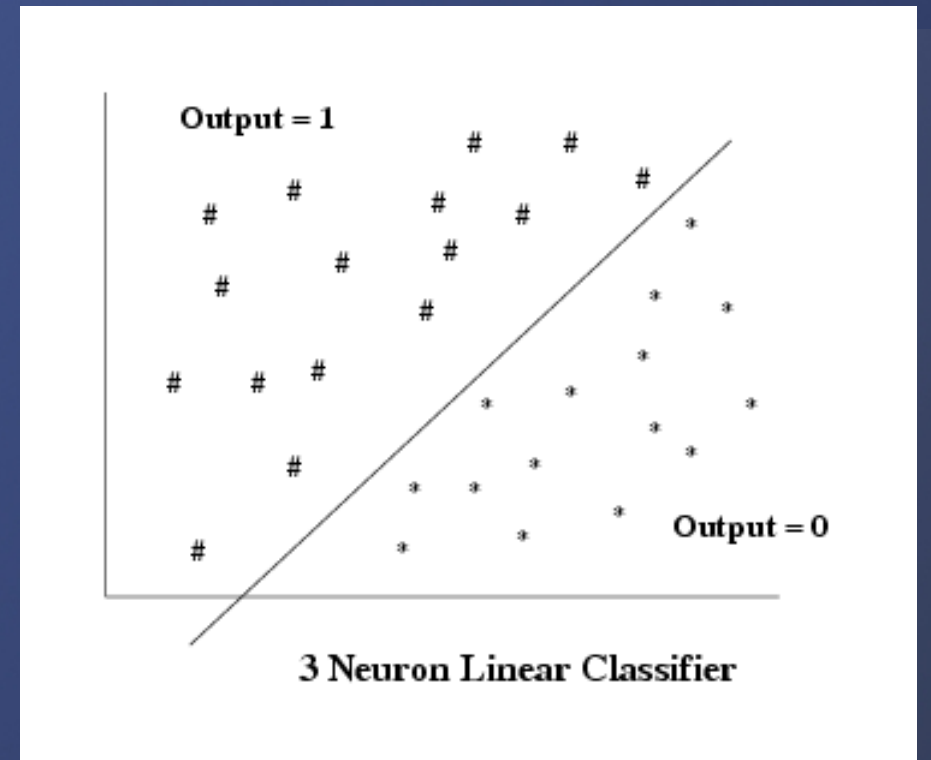


Neuron “Fires” (Output = 1) when Sum of Weights \* Inputs > Threshold

# ANN's

2 Input Neurons  
and one Output  
Neurons can find  
a Linear Class Partition

A Simple Algorithm  
can be used to find  
weights



# ANN's

## What about Harder Problems

- Change Output to Threshold Approximation (Sigmoid, Hyperbolic Tangent)
- Use Calculus to find weights
- Most Common method is Back Propagation
- PSO is gaining favor



ANN's

Technique

Model

Representation

Number of Inputs and Outputs Desired

Topology

Hidden Layers

Train

Test

# ANN's

## Train/Test

Divide Data into 3 Sets  
Training, Testing, Final Test

Try to get a good Mix  
of Data in Each Set  
or  
Use “Leave-One-Out” Technique

# ANN's

## Train/Test

### If Training Fails

Modify the Network Topology

Modify Learning Rate

Modify Momentum

Avoid Overfitting/Overtraining



# ANN's

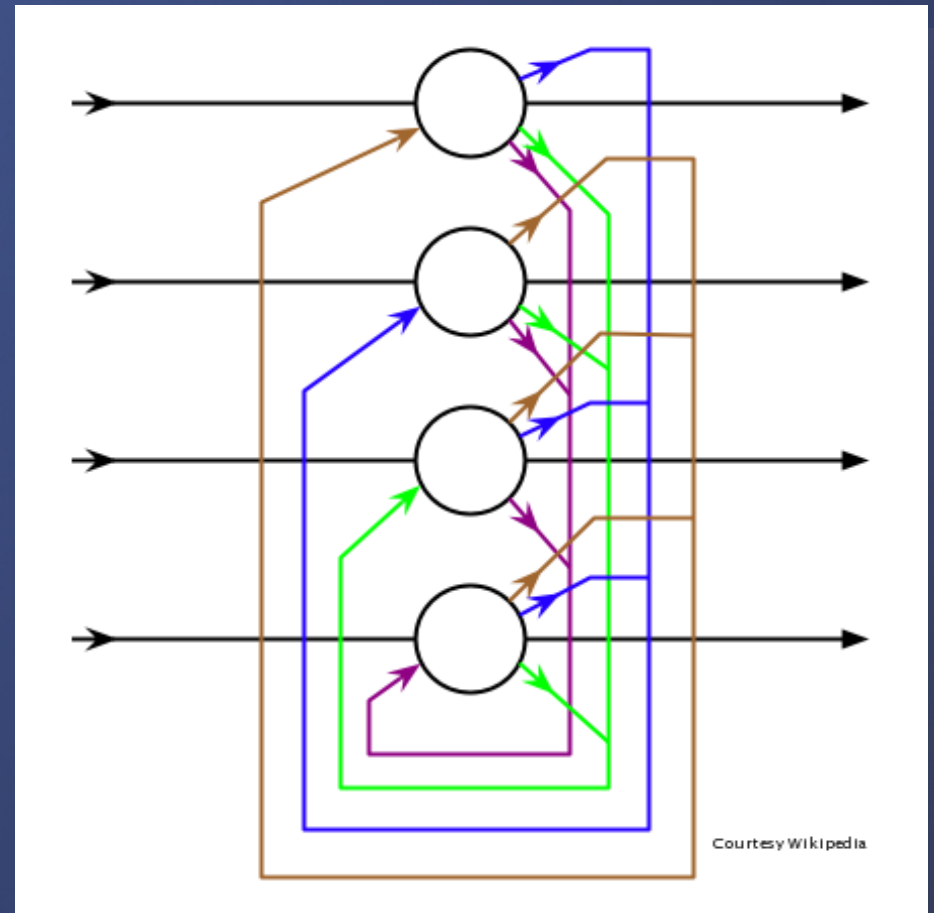
## Recurrent Networks

- Supervised
- Output Tied to Input
- Learns and Generates Sequences

# ANN's

## Recurrent Networks

- Unsupervised
- Fully Connected
- Discrete Outputs  
(+1, -1)
- Stores Vectors
- Can Correctly Generalize  
when Input Noisy



# Fuzzy Systems

## Who Wants Fuzzy Stuff?

Often Exactness just gets  
in the way of Concepts

Allows Intuitive Linguistics  
I.E. “If very hot, turn down  
thermostat a lot”

A TSP Example

# Fuzzy Systems

## Fuzzy Sets

Membership Function

1 if Argument is  
Definitely in Set

0 if Argument is  
Definitely not in Set

Example

$$m(\text{age}) = 0 \quad \text{if } \text{age} \leq 50$$

$$m(\text{age}) = 1 / (1 + (25 / (\text{age} - 50)^2)) \quad \text{if } \text{age} > 70$$

# Fuzzy Systems

Different Than Probability

## Fuzzy Membership

Membership in  
Drinkable Liquid  
Set = 0.91

Expectation  
That it's not  
Poison

After Drinking  
Membership the Same

## Probability

Probability of  
Being Drinkable  
= 0.91

0.09 Probability  
That it's Not  
Drinkable

After Drinking  
Probability is 1 or 0



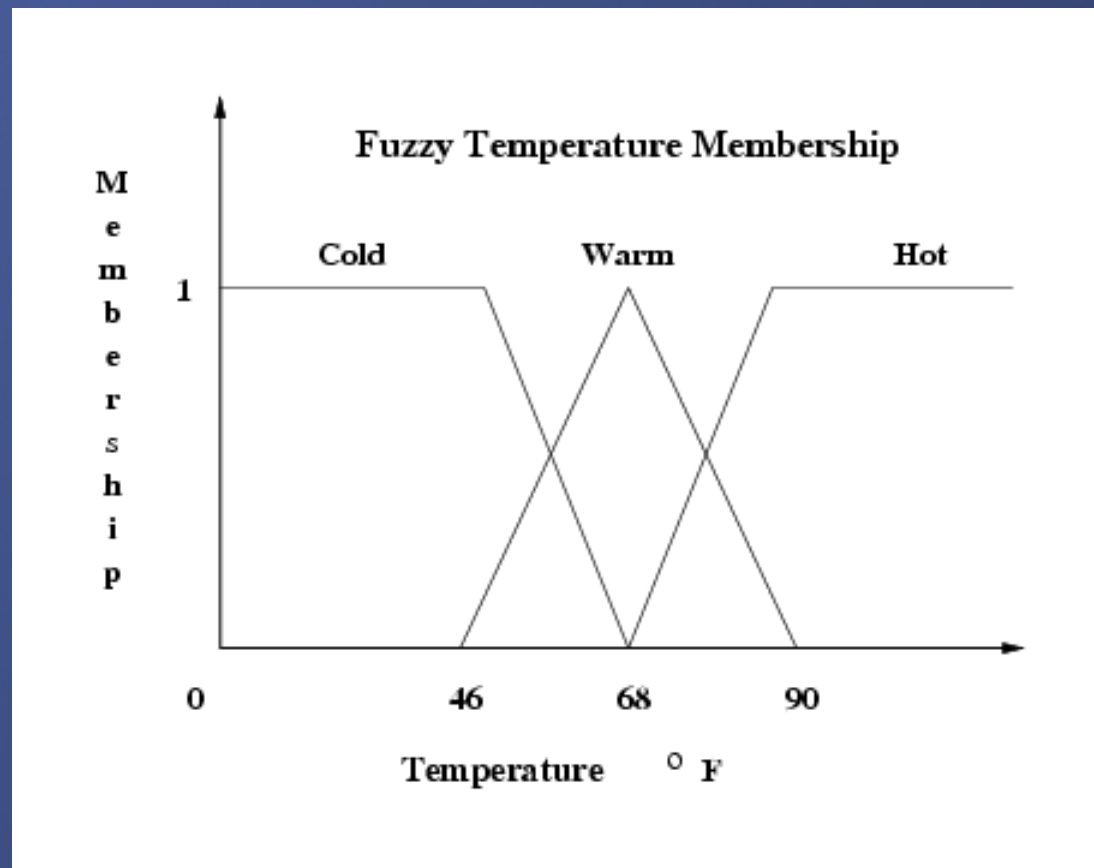
# Fuzzy Systems

## Set Operations

Equality	All Members Equal
Compliment	$1-m$
Union (or)	$\max(m(a), m(b))$
Intersection (and)	$\min(m(a), m(b))$

# Fuzzy Systems

## Fuzzy Temperature



# Fuzzy Systems TSP

Let Longest Possible Path = L

Define Four Membership Functions  
Short, Medium Short, Medium Long,  
and Long

Representation

[3, 2, 4, 6, ...]  
(city list)

Fitness

(Zero is Best)

$$\sum_{j=1}^N \sum_{i=1}^4 \alpha_i \cdot M_{ij}$$

# Ant Colony Optimization

Used in Routing and Scheduling Problems

Like PSO, No Central Control

Where is State Kept?

# Ant Colony Optimization

## Basic TSP Algorithm

```
initialize pheromone deposits
place all k ants in originating city
for t=1 to max {
    - build a trip by choosing
      n-1 cities with probability
      based pheromone distribution
      for each ant
    - compute the trip length for each
      ant
    - if improved route found, update
    - update pheromone deposits
}
output shortest route
```



# Support Vector Machines

Video

# Statistics

## Claims

“My Technique is Better Than Yours!”

“I'm Done! My System is Robust”

Need Statistics to Justify These

# Statistics

## Myths

Better Mean Result Implies Better Technique

Reporting the Mean Result is Good Enough

Reporting the Mean and Standard Deviation is Good Enough

Your Data are Normally Distributed

# Statistics

## More Myths

The Mean Performance for  
Best-of-Run-Individuals is what Matters

10 Runs is Sufficient to show  
Differences Between Groups

# Statistics

Be Careful



# Conclusion

CI is now Practical for Solving Problems

Flexibility and Robustness make it Useful

Understanding the Problem and using  
Creative Skills are the Key to Successful  
Application