


# machine learning for artists


RAY LC

traditional programming: explicitly declare

machine learning: fuzzy knowledge





"SMALL"  
CAR



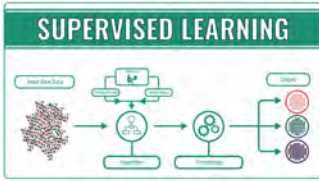
"SMALL"  
PLANET

machine learning: inductive trained experience

Conventional Program	Machine Learning Algorithm
$2 + 2 = 4$	 = Person
$4 + 3 = 7$	 = Person
Always correct about mundane things.	Often correct about complicated things.

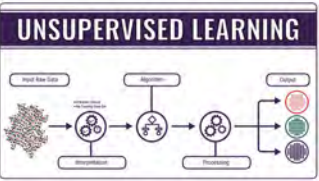
varieties of machine learning

### SUPERVISED LEARNING



neural nets, support vector machines

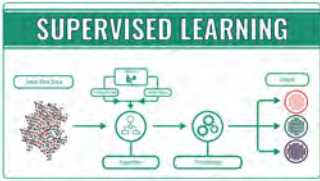
### UNSUPERVISED LEARNING



deep learning combines this with supervised


varieties of machine learning

### SUPERVISED LEARNING



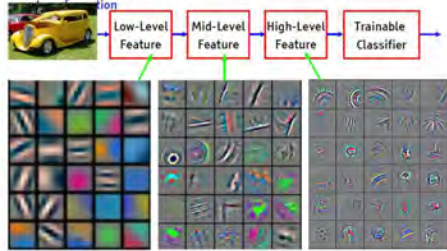
today's topic

### REINFORCEMENT LEARNING



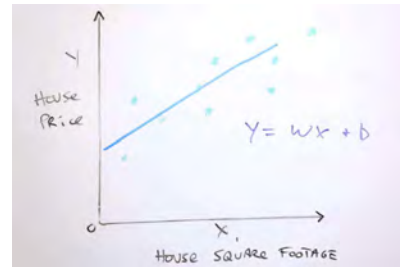
learning of actions-values or state-values

### Deep Learning = Learning Hierarchical Representations

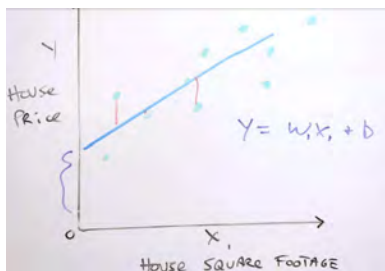


Feature visualization of convolutional net trained on ImageNet from [Zeller & Fergus 2013]

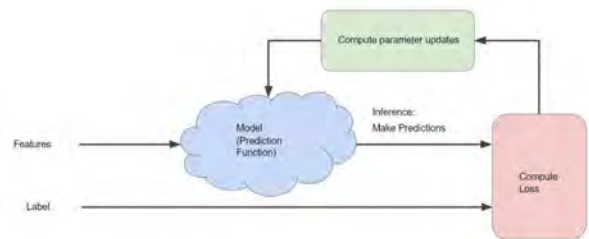
so what is supervised machine learning?



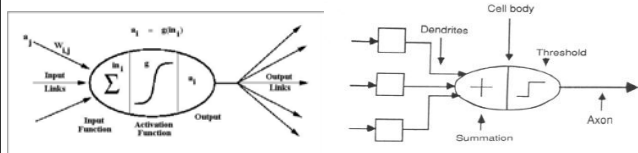
move the line to minimize errors



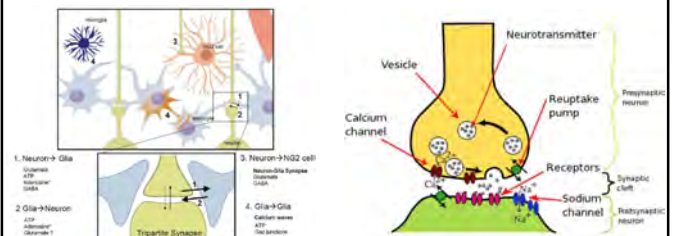
supervised machine learning workflow



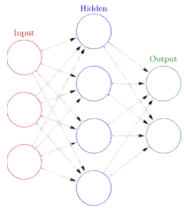
single layer perceptron vs human neuron



in reality in the human neuron



### multilayer neural network



$$\Delta w = w - w_{old}$$

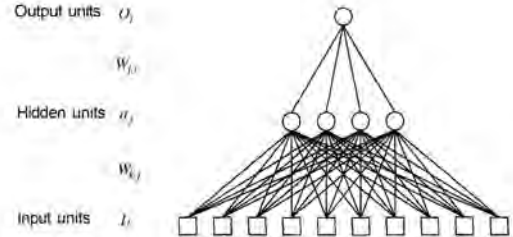
$$= -\text{LearningConstant} \frac{\partial E}{\partial w}$$

$$= (\text{LearningConstant})(y_{target} - y)(x)$$

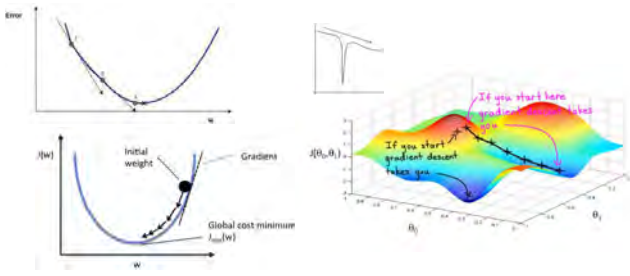
or

$$w = w_{old} + (\text{LearningConstant})(y_{target} - y)(x)$$

### multilayer neural network: credit assignment



### gradient descent in weight space

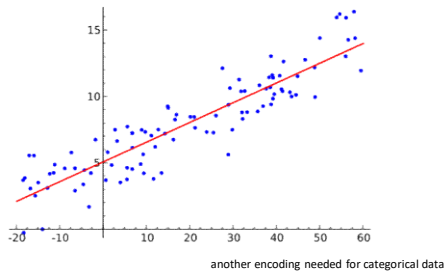


### weight updating using backpropagation

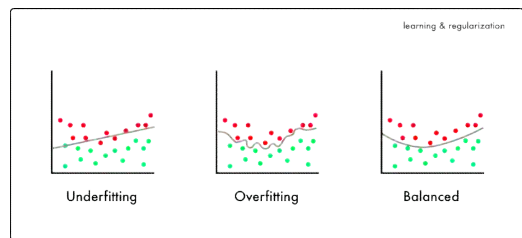
```

repeat
  for each e in examples do
    /* Compute the output for this example */
    O ← RUN-NETWORK(network, Y)
    /* Compute the error and Δ for units in the output layer */
    Erro = To - O
    /* Update the weights leading to the output layer */
    Wj,i ← Wj,i + α × ai × Erro × g'(nj)
  for each subsequent layer in network do
    /* Compute the error at each node */
    Δj ← g'(nj) × ∑i Wj,i Δi
    /* Update the weights leading into the layer */
    Wk,j ← Wk,j + α × Ik × Δj
  end
end
until network has converged
    
```

### multilayer net for statistical regression



### over generalization



mitigate using unsupervised learning (nonspec patterns)

## and now, your exercise

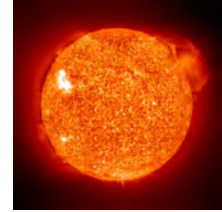
- find photos online that you want to use ML to recognize.
  - use ml5.min.js package and an online engine to classify them.
  - let's write classifyimg.html together (or just use mine).
  - run local SimpleHTTPServer.
  - in js (given you), the call is:  

```
classifier = ml5.imageClassifier('MobileNet', function()
  console.log('Model Loaded!');
});
```
  - then call classifier.predict to make classifications.
- CONTEST:** look for images that machines most likely will get wrong.

## example images found on web



dishwasher: easier for machine than humans



sun that got classified as orange: harder for machines

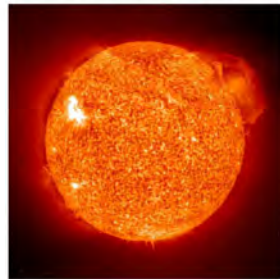
### Image classification

The MobileNet model labeled this as basketball with a confidence of 0.9997



### Image classification

The MobileNet model labeled this as orange with a confidence of 0.38



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