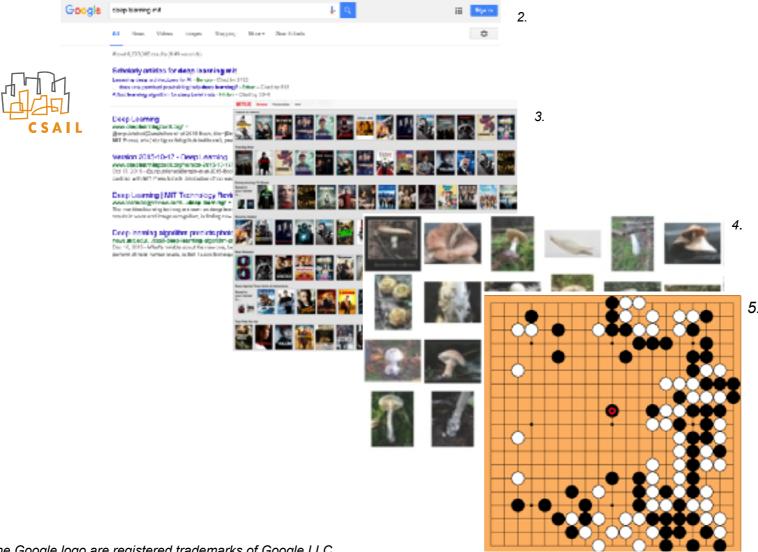
Machine Learning Lecture 1^a

Machine learning is everywhere

 Search, content recommendation, image/scene analysis, machine translation, dialogue systems, automated assistants, game playing, sciences (biology, chemistry, etc), ...



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Machine learning: what is it?

A brief definition

Machine learning as a discipline aims to design, understand and apply computer programs that learn from experience (i.e., data) for the purpose of modeling, prediction, or control

Prediction problems

About future events

Market value

Time

Also collision avoidance, monitoring, medical risk, etc.

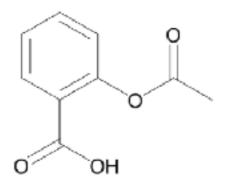
Prediction problems

About properties we don't yet know



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would I like this movie?



soluble in water?



what is the image about?

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"ML is very cool"

what is it in Spanish?

- It is easier to express tasks in terms of examples of what you want (rather than how to solve them)
- E.g., image classification (1K categories)

Image

<u>Category</u>



mushroom

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cherry

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- It is easier to express tasks in terms of examples of what you want (rather than how to solve them)
- E.g., image classification (1K categories)

Image

Category



mushroom

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 Rather than specify the solution directly (hard), we automate the process of finding one based on examples

- It is easier to express tasks in terms of examples of what you want (rather than how to solve them)
- E.g., image classification (1K categories)



Category

mushroom

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 Rather than specify the solution directly (hard), we automate the process of finding one based on examples

- It is easier to express tasks in terms of examples of what you want (rather than how to solve them)
- No limit to what you can learn to predict...

<u>English</u>		<u>Spanish</u>
$h($ Is it real? ; $\theta)$	=	¿Es real?
Will it continue?		¿Continuará?
For how long?		¿Por cuanto tiempo?
■■■		

Already in production for some language pairs (Google)

A concrete example

Learning to predict preferences from just a little data...

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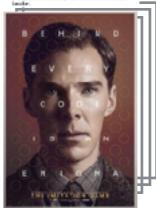
9. © 2020 The Studios At Paramount.

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12.© Disney

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© Black Bear Pictures

A concrete example

Learning to predict preferences from just a little data...

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interstellar (2014) Poster

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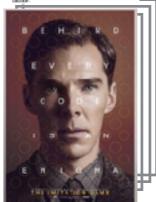
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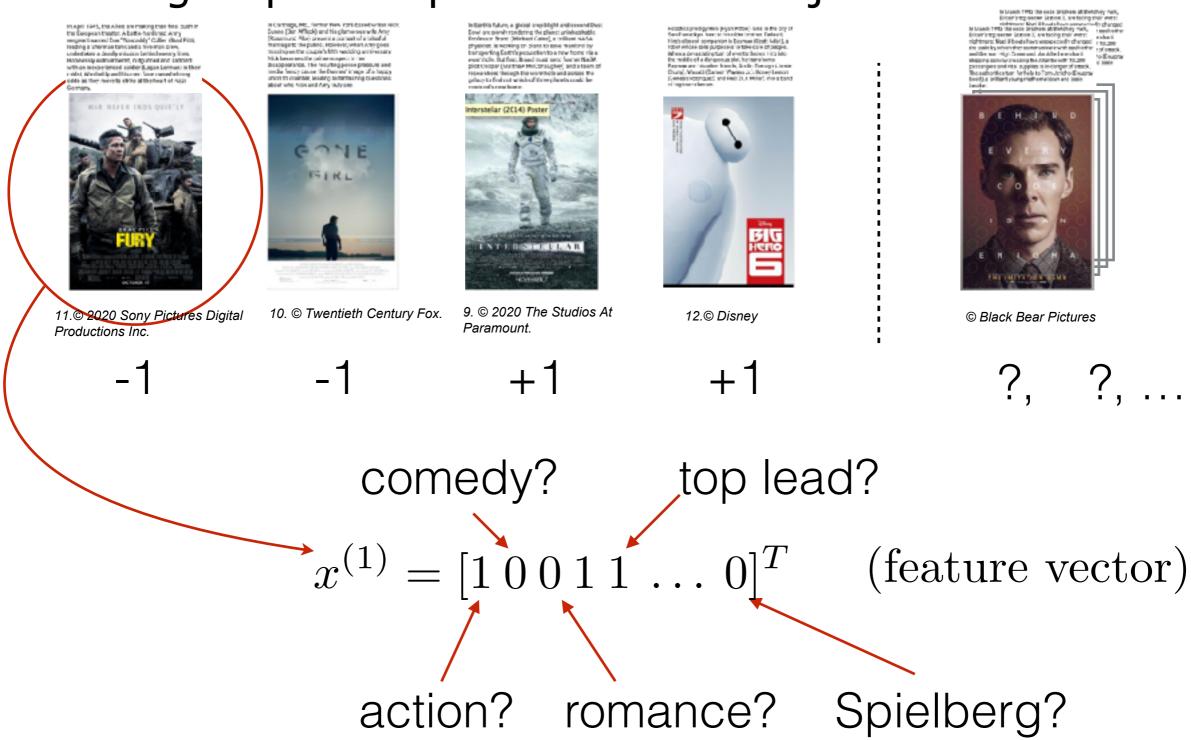
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A concrete example

Learning to predict preferences from just a little data...



Supervised learning

Learning to predict preferences from just a little data...



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10. © Twentieth Century Fox. $x^{(2)}$

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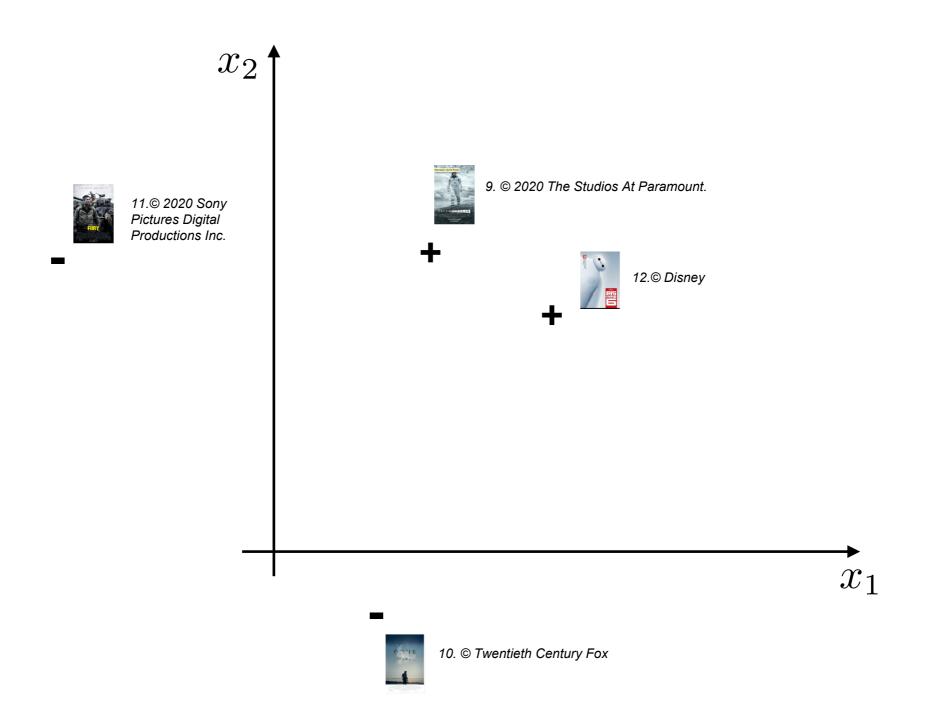
© Black Bear Pictures $x^{(5)}, x^{(6)}, \ldots$

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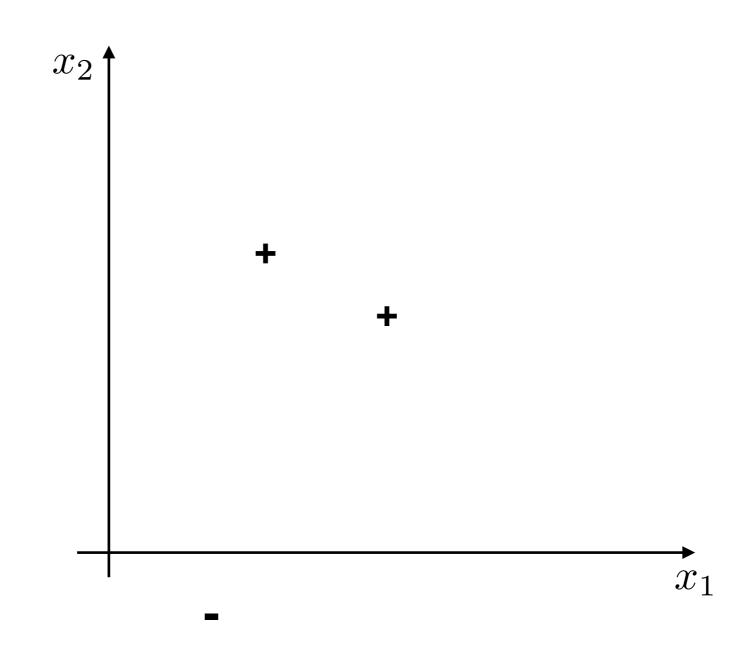
Training set

Test set

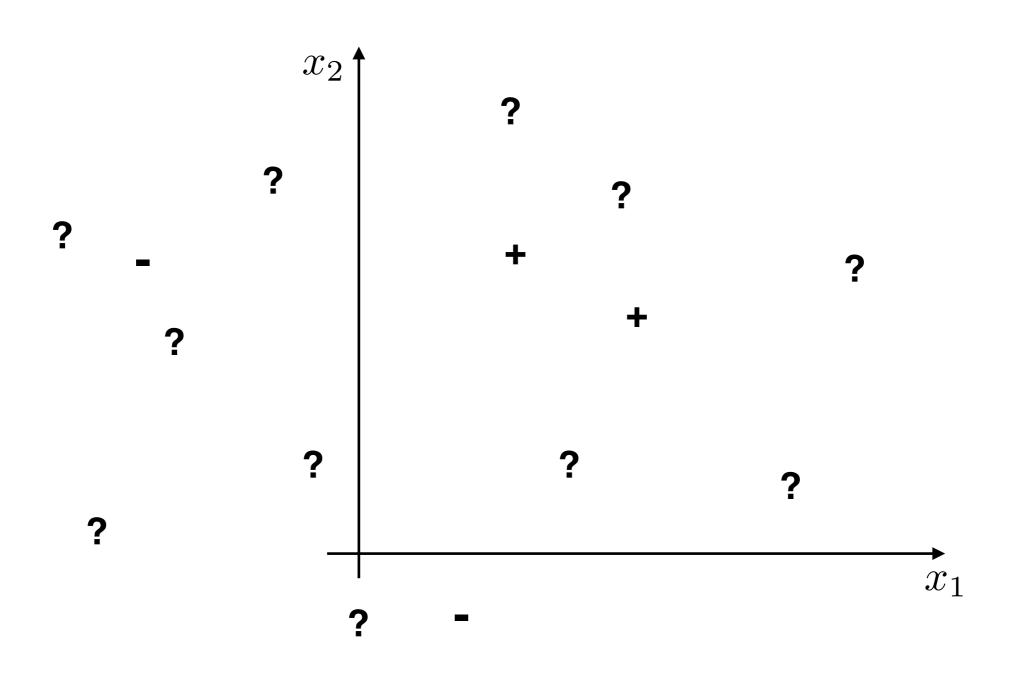
Supervised learning



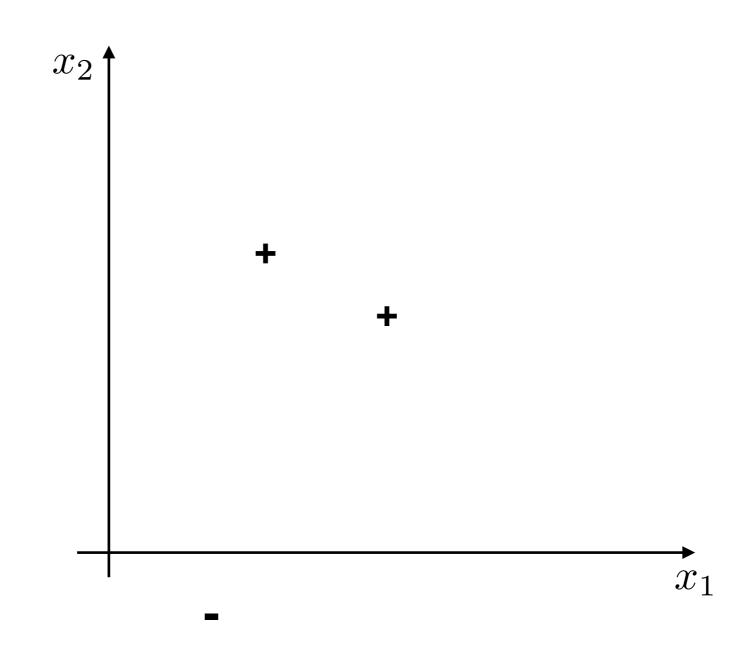
Supervised learning: training set

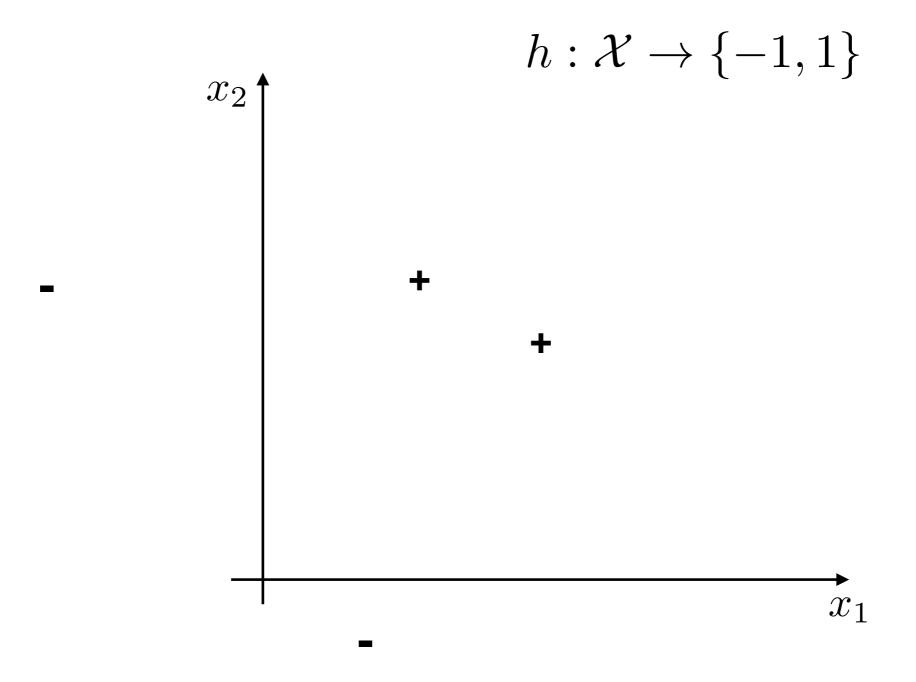


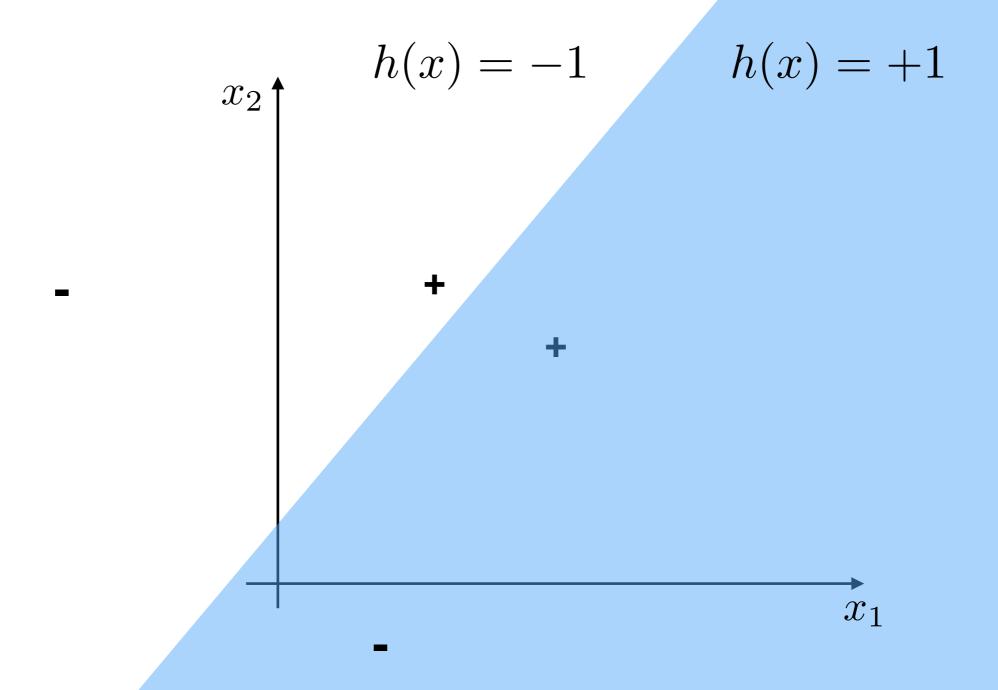
Supervised learning: test set

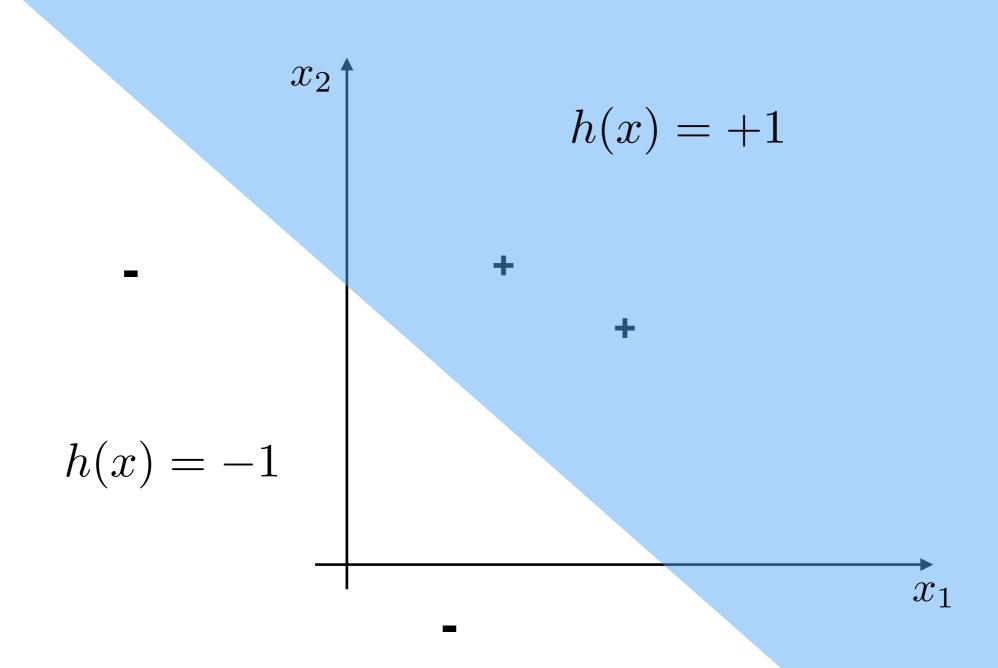


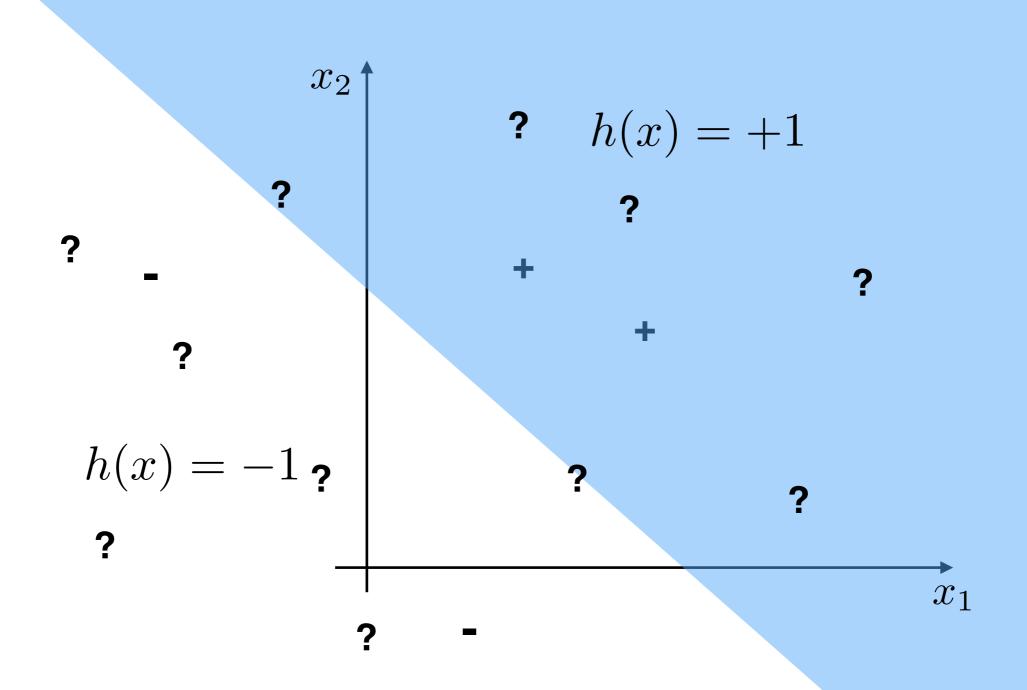
Supervised learning: training set

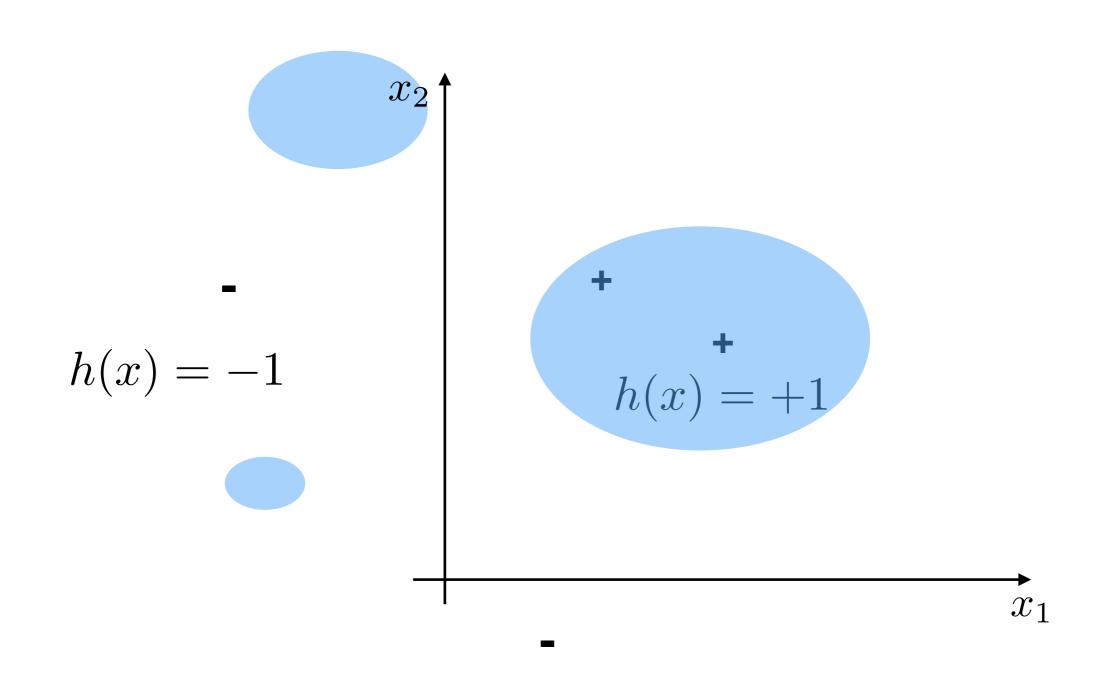


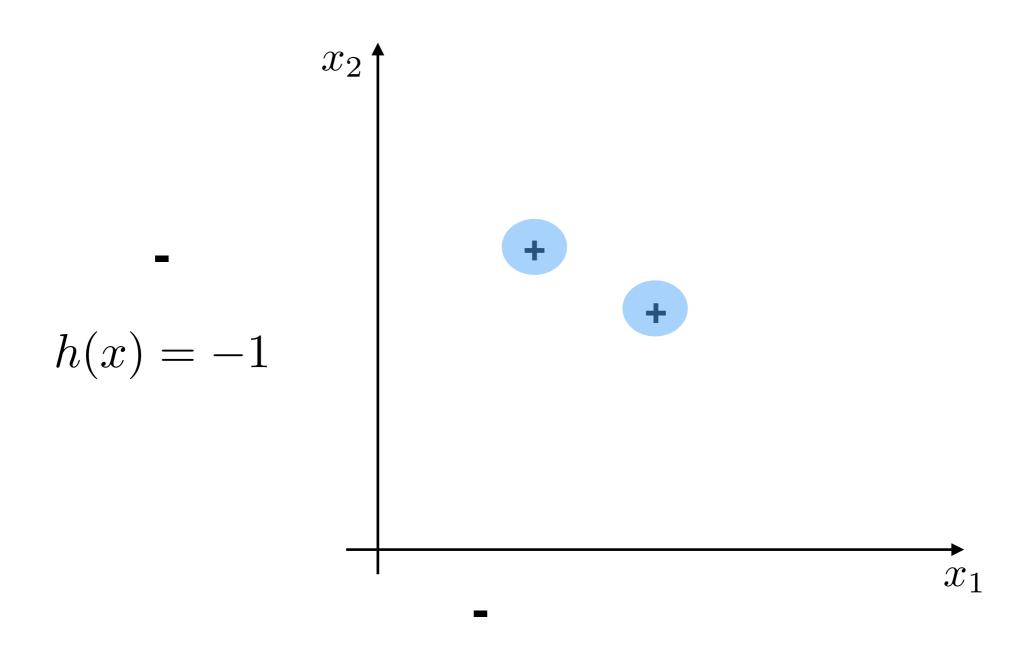




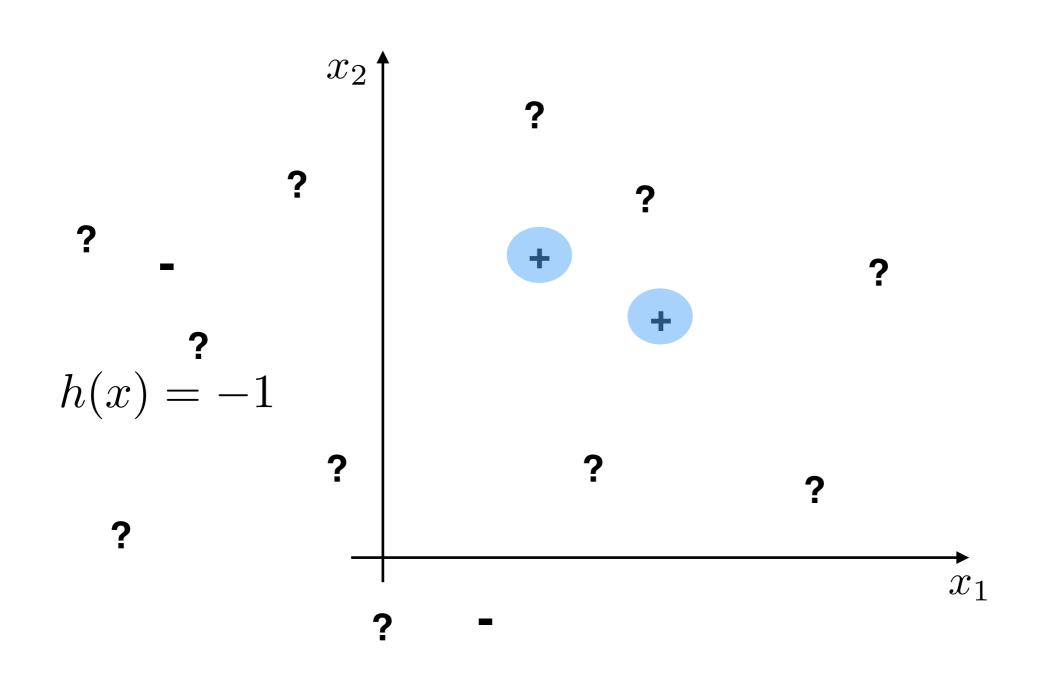








Supervised learning: generalization



Supervised learning +

Multi-way classification (e.g., three-way classification)

$$h\left(\begin{array}{c} \downarrow \downarrow \downarrow \downarrow \\ \downarrow \downarrow \downarrow \downarrow \downarrow \end{array}\right) = \text{politics} \qquad h: \mathcal{X} \to \{\text{politics, sports, other}\}$$

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Regression

$$h\left(\begin{array}{c} \\ \\ \\ \\ \\ \end{array}\right) = \$1,349,000 \qquad h: \mathcal{X} \to \mathbb{R}$$

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Structured prediction

$$h\left(\begin{array}{c} \text{A group of people} \\ = \text{shopping at an} \\ \text{outdoor market} \end{array}\right) = \begin{array}{c} \text{A group of people} \\ \text{shopping at an} \\ \text{outdoor market} \end{array}$$
 $h: \mathcal{X} \to \{\text{English sentences}\}$

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Types of machine learning

- Supervised learning
 - prediction based on examples of correct behavior
- Unsupervised learning
 - no explicit target, only data, goal to model/discover
- Semi-supervised learning
 - supplement limited annotations with unsupervised learning
- Active learning
 - learn to query the examples actually needed for learning
- Transfer learning
 - how to apply what you have learned from A to B
- Reinforcement learning
 - learning to act, not just predict; goal to optimize the consequences of actions
- Etc.

Key things to understand

- Posing supervised machine learning problems
- Supervised classification
- The role of training/test sets
- A classifier
- A set of classifiers
- Errors, generalization

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Movie poster thumbnail for the film "Fury"

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Movie poster thumbnail for "Big Hero 6"

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Thumbnail of a group of people shopping at an outdoor market

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