

CSE 158 – Lecture 1.5

Web Mining and Recommender Systems

Supervised learning – Regression

What is supervised learning?

Supervised learning is the process of trying to infer from **labeled data** the underlying function that produced the labels associated with the data

What is supervised learning?

Given **labeled training data** of the form

$$\{(\text{data}_1, \text{label}_1), \dots, (\text{data}_n, \text{label}_n)\}$$

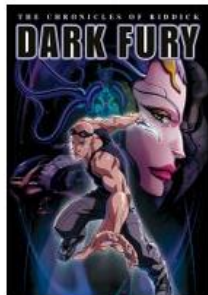
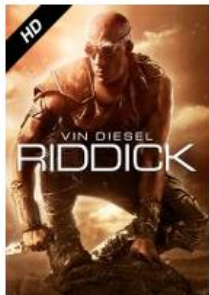
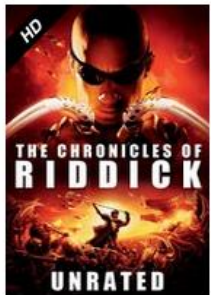
Infer the function

$$f(\text{data}) \xrightarrow{?} \text{labels}$$

Example

Suppose we want to build a movie recommender

e.g. which of these films will I rate highest?



Example

Q: What are the labels?

A: ratings that others have given to each movie, and that I have given to other movies

103 of 115 people found the following review helpful

★★★★★ Excellent Sci-Fi, September 12, 2000

By **Kick_3_Easy** (Los Angeles, New York) - [See all my reviews](#)

This review is from [Pitch Black \(Universal\) \(DVD\)](#) (DVD)

Pitch Black was arguably one of the most overlooked films of the early year. Although the setting of the film could seem routine to a casual viewer (space travelers stranded and bickering on a hostile planet infested with alien nasties), director David Twohy's wonderful use of color and stylistic flourishes more than makes up for any trivial complaints. For those of you curious about the film's plot, it deals with a group of marooned space "passengers" who spend the majority of their time searching for a way to evacuate a harsh desert planet. Their efforts are unexpectedly forced to quieten however when they discover a particularly vicious type of nocturnal alien ready to emerge to the planet's surface during an eclipse. Viewers can't help but like the film's villainous hero played by Vin Diesel as Boller Room/who brings to memory Arnold Schwarzenegger's famous role as the Terminator. The film looks and sounds great and has more than a few moments of nail-biting tension thrown in for good measure. For Science Fiction fans this is a masterpiece. And as for the rest of you, try giving this fine movie a chance. You'll thank me when you do.

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37 of 40 people found the following review helpful

★★★★★ Sadly missed from the theatre, September 1, 2000

By **Rick Chedid** (Delray Beach, Florida) - [See all my reviews](#)

This review is from [Pitch Black \(Universal\) \(DVD\)](#) (DVD)

I rate movies along simple lines. There are classics, there are flicks and there are horrible pieces not worth the film that they were printed on. I sadly skipped Pitch Black in the theatre. The trailer was horrible. I couldn't make out "anything" about the movie and had no interest in seeing it. Thankfully, on vacation, I was hooked up in a hotel that had Pitch Black on pay-per-view and decided to give it a try. I was stunned. Not only did I wish I had seen it in the theatre - to truly appreciate the special effects - but I enjoyed the quirky dialogue between the characters. I appreciated the seeming abandon with which character upon character is removed from the story line without my slightest of predators sensing me in the slightest. The dialogue is often cheeky. These people are space faring commoners and the movie revolves around the predicament their face and not their lives. Their lives form the substance to which I temporarily attached care for each. Short-lived as it may be, this care for the characters extended throughout the movie and left me feeling very satisfied. I recommend this movie as a flick. It should have been seen by all in the theatre but we weren't all as fortunate. Check it out by yourself and if you like it tell the friends around. Give it a chance. Van Diesel is what it's all about. You'll recognize him from Saving Private Ryan. The washed out scenes reminded me of Gladiator and Three Kings. The world as seen through the eyes of the aliens put me back in Fitcher's Alenx. While ultimately the plot is too fantasy I let the movie take me away. In much the same way we all let Star Wars (the first three) move us and Starship Troopers moved us (appealed to our collective bizarre fascist sensibility or something). Have fun with it. I know I did.

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18 of 19 people found the following review helpful

★★★★★ Cool monster flick, November 14, 2000

By **Kathy** - [See all my reviews](#)

This review is from [Pitch Black \(DVD\) \(DVD\)](#) (DVD)

This is a damned good sci-fi horror flick. Okay, it isn't really scary (more tension inducing than terror inducing) and you do have to take it with a grain of salt, but in general, it is a very decent movie for the genre. I would say it is a fair bit like Aliens - same sort of feel, though not so humorous. (Well, they don't have a Hudson, so you know). The beasts are great - sort of like dragons or basilisks with a bit of Starship Trooper bug thrown in. More straight predators than anything else, but with a genius for seeking out prey. The hardest part of the plot to accept is that anyone makes it out alive. Especially as the beasts stalk for light seems to fade when they get really hungry (see Johns with gun torch scene). The acting is pretty cool by all actors, but yes, Vin Diesel is great as Riddick with his awesome "shut-up" and Cole Hauser has to come in for a mention with his fantastic portrayal of the morally ambiguous William Johns, bounty hunter. It was Cole Hauser who was the central male character in my opinion - Riddick was the central male character (so he didn't have to steal scenes - they were already his). Riddick and Johns were excellent characters and both actors gave talented portrayals. I was really surprised to learn that Cole Hauser has 20 in real life - he made me believe his character has a good 30 or there very year. The 3 central characters (Ridha Mitchell as Carolyn, Cole Hauser as Johns, and Vin Diesel as Riddick) were used to explore the theme of courage with interesting results. Personally, I would consider all three characters as brave beyond belief but I wonder whether the movie intends me to think that way - after all, all three of them do some questionable things in the name of survival. The director of the film has a bright future - it was well done and convincing. You could see that some effects were low-budget, but they were used so well that it didn't matter. The opening scenes could be described as awesome - the lighting, Riddick's voice over, the look and feel of the pilot area - all brilliant. All in all, a great movie and definitely worth watching more than once.

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83 of 101 people found the following review helpful

★★★★★ Fast, smart, enjoyable filmmaking, November 14, 2000

By **A Customer**

This review is from [Pitch Black \(Universal\) \(DVD\)](#) (DVD)

Hel has surely frozen over. That's the only way to explain how David Twohy, writer-director of the so-bad-it's-hilarious Charlie Sheen slyding epic "Terminal Velocity," has made a movie this good. It's not high art, but "Pitch Black" is a triumph within its genre, a suspenseful, intelligent monster movie with surprisingly deep characters. A damaged spaceship loaded with cargo and enervating passengers crashes-land on an alien world where three sure create perpetual daylight. At first, the survivors think their biggest problem is the vicious convict who escaped from the wreckage. Then they discover the light-fearing predators lurking beneath the planet's surface. And then comes the total eclipse... "Pitch Black" is a Diesel-powered movie. Vin Diesel, that is. As the marauding convict Richard P. Riddick, Diesel gives a ferociously intelligent and charismatic performance, backed-up by Twohy's surprisingly nuanced script. You'll come to root for Riddick as the movie wears on, but that doesn't necessarily mean you'll like him. Ridha Mitchell is also fine as the movie plot fly, setting inner and outer demons as she tries to hold the survivors together. Cole Hauser does a nice turn as Riddick's captor, and the film's supporting cast includes Keith David as a Muslim cleric (a refreshingly positive portrayal of Islam) and "Parasite" star Vincent D'Onofrio as Claude Black. "Pitch Black" is an embarrassment of riches for sci-fi: characters who continually surprise you, creepy creatures left mostly up to your imagination, and a strap-down story that moves at a breakneck pace. Perfect popcorn entertainment-- just be sure you don't turn _all_ the lights off before you watch it...

Help other customers find the most helpful reviews

Was this review helpful to you? [Yes](#) [No](#) [Report Abuse](#) [Comments](#) (1)

18 of 20 people found the following review helpful

★★★★★ A Slick Sci-Fi Thriller, May 3, 2001

By **A. Phillips** - [See all my reviews](#)

This review is from [Pitch Black \(DVD\) \(DVD\)](#) (DVD)

Example

Q: What is the data?

A: features about the movie and the users who evaluated it

Movie features: genre, actors, rating, length, etc.

Product Details

Genres	Science Fiction , Action , Horror
Director	David Twohy
Starring	Vin Diesel , Radha Mitchell
Supporting actors	Cole Hauser , Keith David , Lewis Fitz-Gerald , Claudia Black , Rhiana Gr Angela Moore , Peter Chiang , Ken Twohy
Studio	NBC Universal
MPAA rating	R (Restricted)
Captions and subtitles	English Details ▾
Rental rights	24 hour viewing period. Details ▾
Purchase rights	Stream instantly and download to 2 locations Details ▾
Format	Amazon Instant Video (streaming online video and digital download)

User features:
age, gender,
location, etc.

A. Phillips

Reviewer ranking: #17,230,554

90% helpful

votes received on reviews
(151 of 167)

ABOUT ME

Enjoy the reviews...

ACTIVITIES

[Reviews](#) (16)

[Public Wish List](#) (2)

[Listmania Lists](#) (2)

[Tagged Items](#) (1)

Example

Movie recommendation:

$$f(\text{data}) \xrightarrow{?} \text{labels}$$

=

$$f(\text{user features, movie features}) \xrightarrow{?} \text{star rating}$$

Solution 1

Design a system based on **prior knowledge**, e.g.

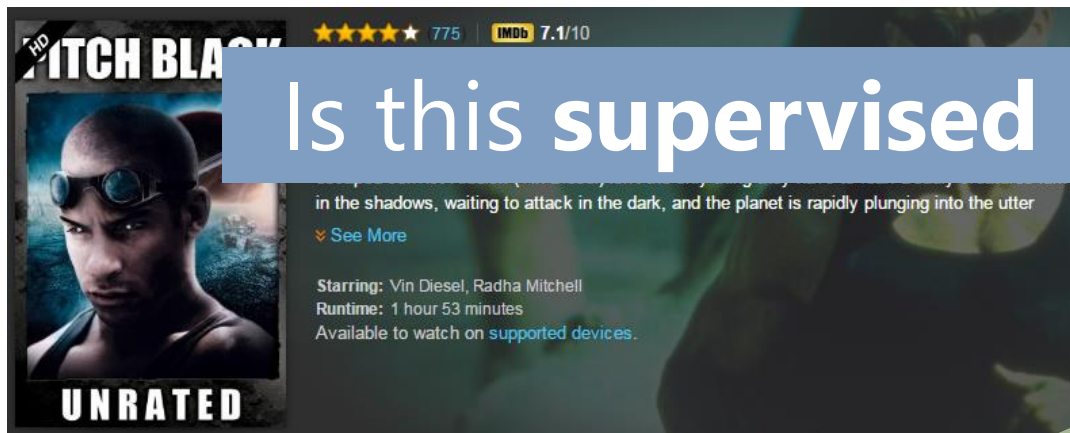
```
def prediction(user, movie):
    if (user['age'] <= 14):
        if (movie['mpaa_rating'] == "G"):
            return 5.0
        else:
            return 1.0
    else if (user['age'] <= 18):
        if (movie['mpaa_rating'] == "PG"):
            return 5.0
    .... Etc.
```

Is this **supervised learning**?

Solution 2

Identify words that I frequently mention in my social media posts, and recommend movies whose plot synopses use **similar** types of language

Plot synopsis



Is this supervised learning?

$\text{argmax similarity}(\text{synopsis}, \text{post})$

Social media posts



Solution 3

Identify which attributes (e.g. actors, genres) are associated with positive ratings. Recommend movies that exhibit those attributes.

Is this **supervised learning**?

Solution 1

(design a system based on prior knowledge)

Disadvantages:

- Depends on possibly false **assumptions** about how users relate to items
- Cannot adapt to new data/information

Advantages:

- Requires no data!

Solution 2

(identify similarity between wall posts and synopses)

Disadvantages:

- Depends on possibly false **assumptions** about how users relate to items
- May not be adaptable to new settings

Advantages:

- Requires data, but does not require **labeled** data

Solution 3

(identify attributes that are associated with positive ratings)

Disadvantages:

- Requires a (possibly large) dataset of movies with labeled ratings

Advantages:

- Directly optimizes a measure we care about (predicting ratings)
- Easy to adapt to new settings and data

Supervised versus unsupervised learning

Learning approaches attempt to **model data** in order to solve a problem

Unsupervised learning approaches find patterns/relationships/structure in data, but **are not** optimized to solve a particular predictive task

Supervised learning aims to directly model the relationship between input and output variables, so that the output variables can be predicted accurately given the input

Regression

Regression is one of the simplest supervised learning approaches to learn relationships between input variables (features) and output variables (predictions)

Linear regression

Linear regression assumes a predictor of the form

$$X\theta = y$$

matrix of features
(data)

unknowns
(which features are relevant)

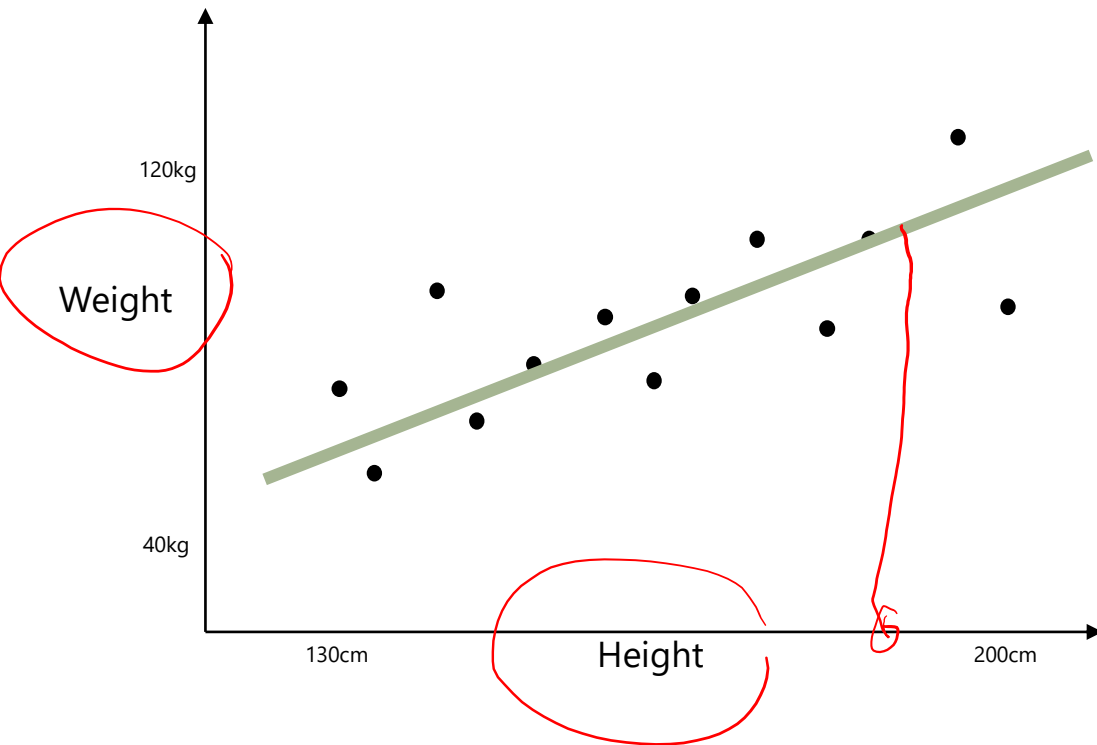
vector of outputs
(labels)

The diagram illustrates the equation $X\theta = y$. Three green arrows point from descriptive labels below to the terms in the equation: one from 'matrix of features (data)' to X , one from 'unknowns (which features are relevant)' to θ , and one from 'vector of outputs (labels)' to y .

(or $Ax = b$ if you prefer)

Motivation: height vs. weight

Q: Can we find a line that (approximately) fits the data?



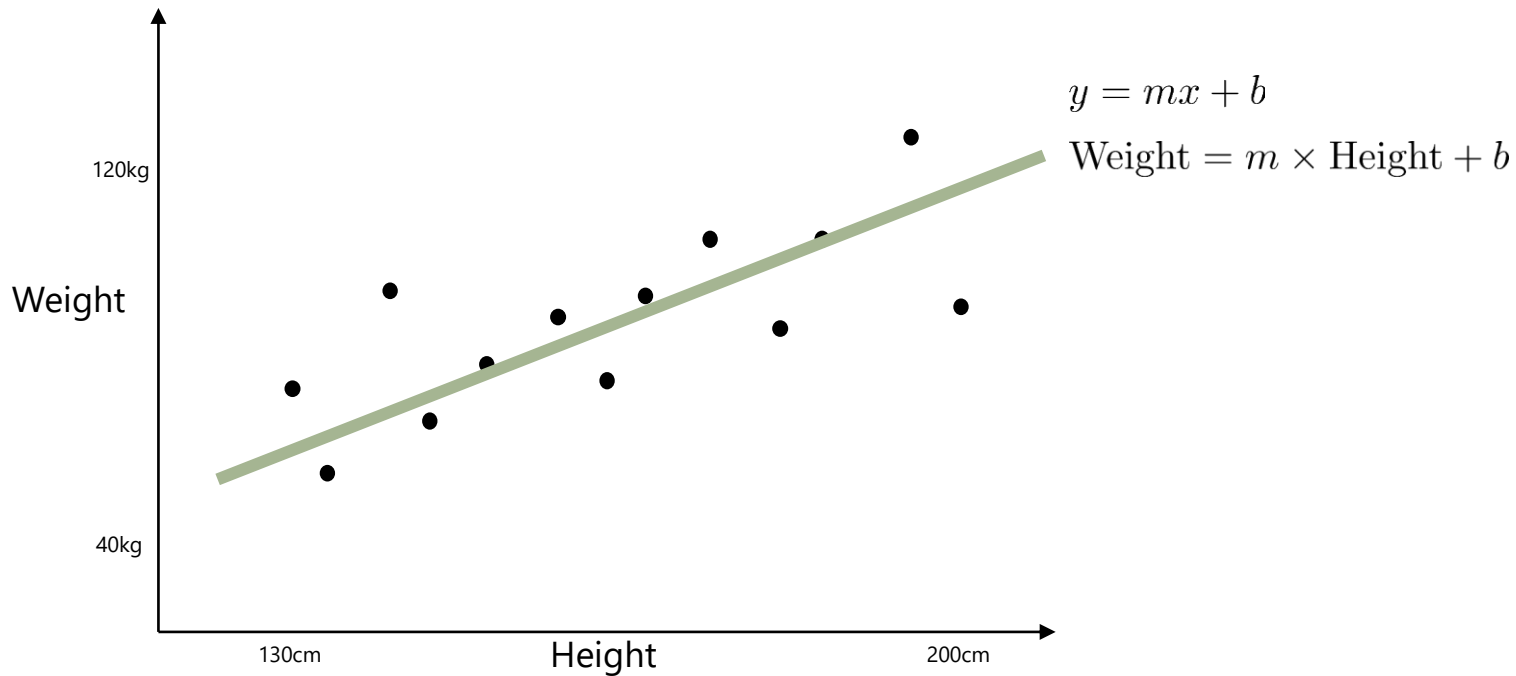
Motivation: height vs. weight

Q: Can we find a line that (approximately) fits the data?

- If we can find such a line, we can use it to make **predictions** (i.e., estimate a person's weight given their height)
 - How do we **formulate** the problem of finding a line?
 - If no line will fit the data exactly, how to **approximate**?
 - What is the "best" line?

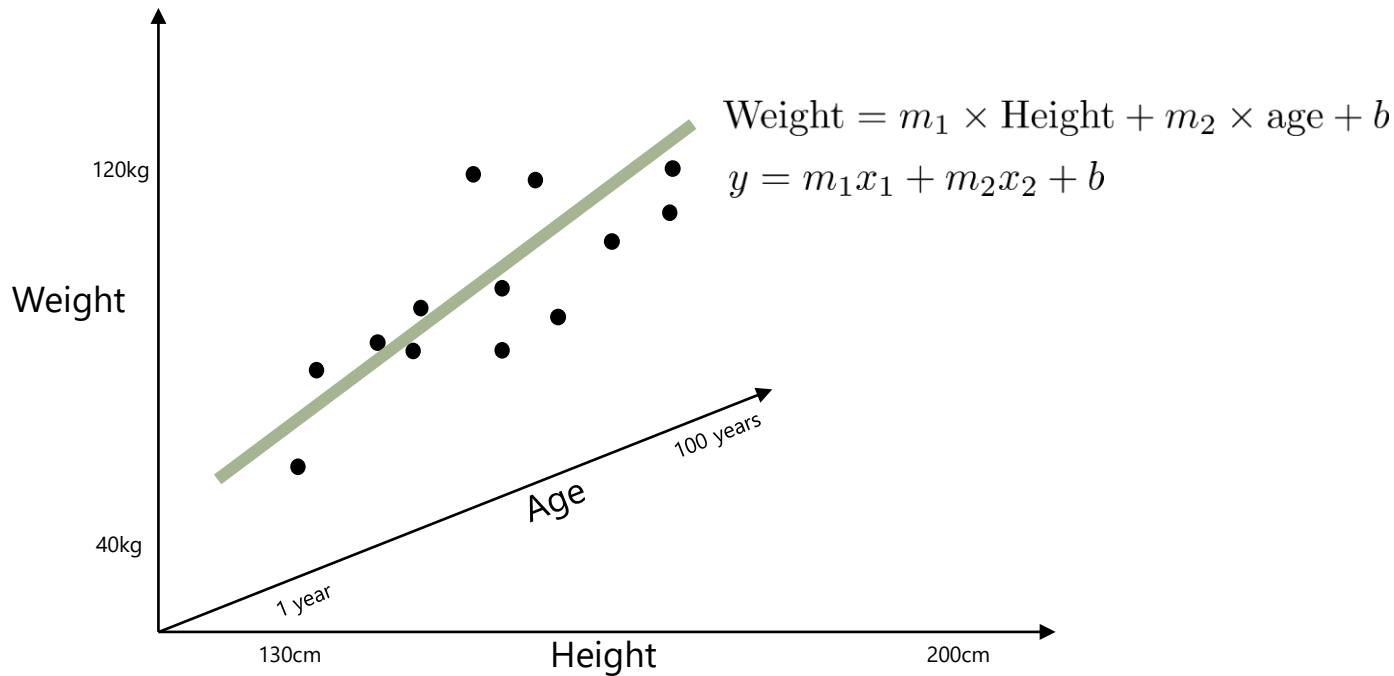
Recap: equation for a line

What is the formula describing the line?



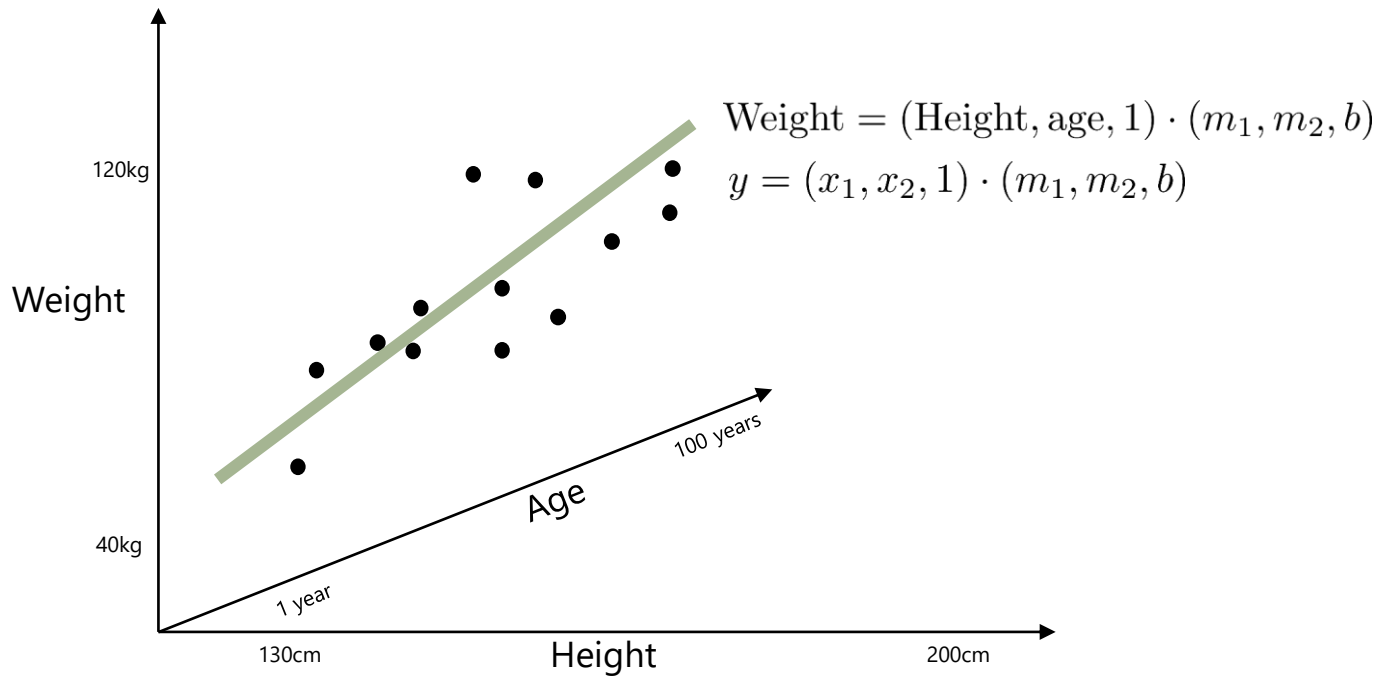
Recap: equation for a line

What about in more dimensions?



Recap: equation for a line as an inner product

What about in more dimensions?



height	age	1
170	28	1
⋮	⋮	⋮
180	33	1

$$\begin{bmatrix} \alpha_1 \\ \alpha_2 \\ \vdots \end{bmatrix} =$$

weights
160
⋮
150



X

x



0

=



y

Linear regression

Linear regression assumes a predictor of the form

$$X\theta = y$$

Q: Solve for theta

A:

$$\theta = (X^T X)^{-1} X^T y$$

Example 1

How do preferences toward certain beers vary with age?

Example 1

Beeradvocate

Beers:



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BA SCORE 100 world-class 9,587 Ratings	THE BROS 95 world-class (view ratings)	Ratings: 9,587 Reviews: 2,537 rAvg: 4.59 pDev: 9.59% Wants: 2,109 Gots: 4,563 FT: 472
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Brewed by:
Goose Island Beer Co. 
Illinois, United States

Style | ABV
American Double / Imperial Stout | 13.80% ABV

Availability: Winter

Notes/Commercial Description:
60 IBU

(Beer added by: drewbage on 06-26-2003)

Ratings/reviews:



4.35/5 rDev -5.2%

look: 4 | smell: 4.25 | taste: 4.5 | feel: 4.25 | overall: 4.25

Serving: 355 mL bottle poured into a 9 oz Libbey Embassy snifter ("bottled on: 08AUG14 1109").

Appearance: Deep, dark near-black brown. Hazy, light brown fringe of foam and limited lacing; no head.

Smell: Roasted malt, vanilla, and some warming alcohol.

Taste: Roasted malts, cocoa, burnt caramel, molasses, vanilla and dark fruit. Bourbon barrel is hinted at but never takes over.

Mouthfeel: Medium to full body and light carbonation with a very lush, silky smooth feel.

Overall: Not as complex or intense as some newer barrel-aged stouts, but so smooth and balanced with all the elements tightly integrated.

HipCzech, Yesterday at 05:38 AM

User profiles:



HipCzech
Aficionado
Male, from Texas
Profile Page

Member Since:	Jul 12, 2014	HipCzech was last seen:
Points:	175	Today at 12:19 AM
Beers:	108	
Places:	6	
Posts:	smoother than all of...	0
Likes Received:	0	
Trading:	0% 0	

Example 1

50,000 reviews are available on

http://jmcauley.ucsd.edu/cse158/data/beer/beer_50000.json

(see course webpage)

See also – non-alcoholic beers:

<http://jmcauley.ucsd.edu/cse158/data/beer/non-alcoholic-beer.json>

Example 1

Real-valued features

How do preferences toward certain beers vary with age?

How about **ABV**?

$$\text{rating}_i = \theta_0 + \theta_1 \times \text{age}_i$$

(code for all examples is on <http://jmcauley.ucsd.edu/cse158/code/week1.py>)

Example 1

Real-valued features

What is the interpretation of:

$$\theta = (3.4, 10e^{-7})$$

(code for all examples is on <http://jmcauley.ucsd.edu/cse158/code/week1.py>)

Example 2

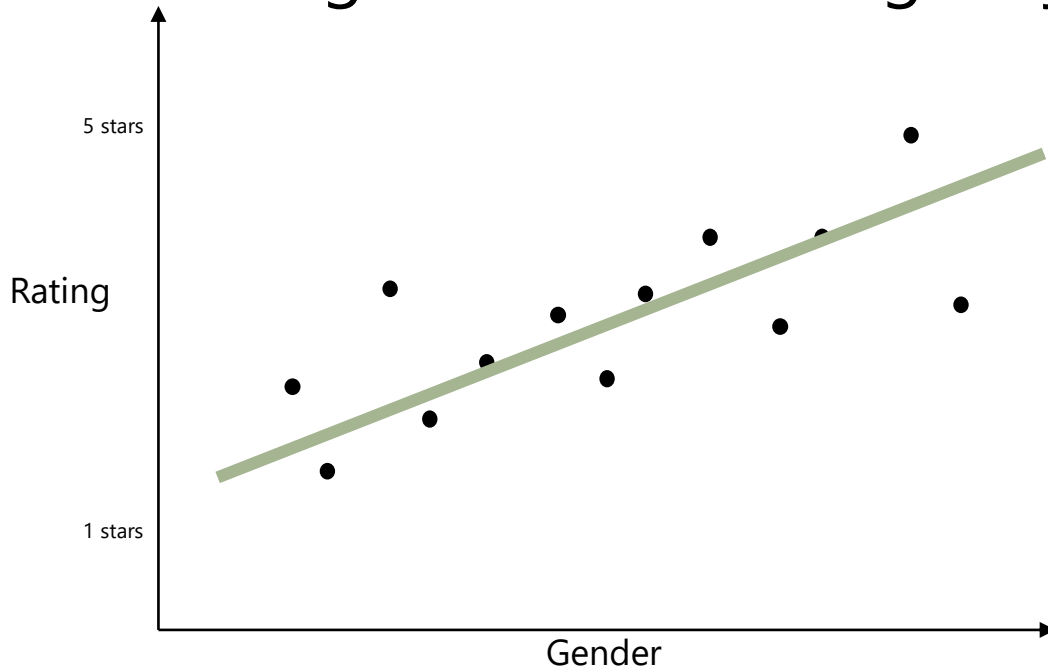
Categorical features

How do beer preferences vary as a function of **gender**?

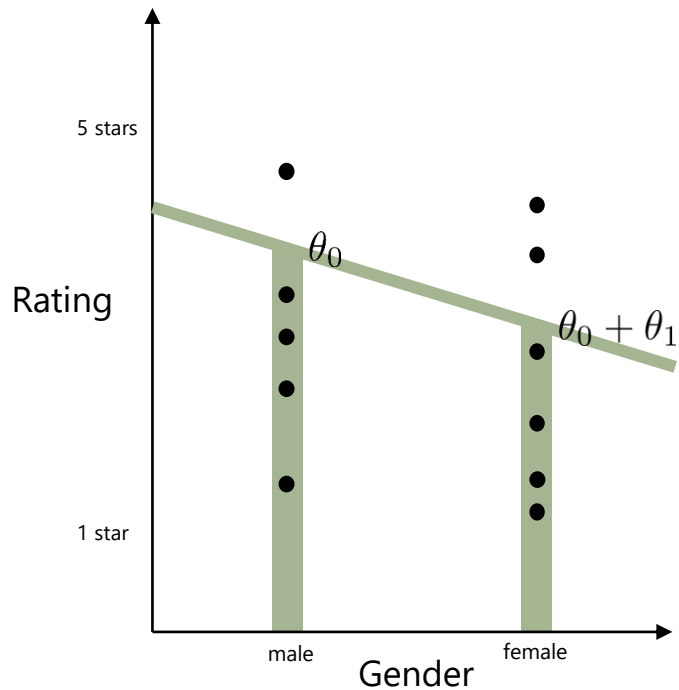
(code for all examples is on <http://jmcauley.ucsd.edu/cse158/code/week1.py>)

Example 2

E.g. How does rating vary with **gender**?



Example 2



θ_0 is the (predicted/average) rating for males

θ_1 is the **how much higher** females rate than males (in this case a negative number)

We're really still fitting a line though!

Example 3

Random features

What happens as we add more and more **random** features?

(code for all examples is on <http://jmcauley.ucsd.edu/cse158/code/week1.py>)

Exercise

How would you build a feature to represent the **month**, and the impact it has on people's rating behavior?