

Introduction to Machine Learning (with Python)

Andreas Mueller

Hi Andy,

I just received an email from the first tutorial speaker, presenting right before you, saying he's ill and won't be able to make it.

I know you have already committed yourself to two presentations, but is there anyway you could increase your tutorial time slot, maybe just offer time to try out what you've taught? Otherwise I have to do some kind of modern dance interpretation of Python in data :-)
-Leah

Hi Andreas,

I am very interested in your Machine Learning background. I work for X Recruiting who have been engaged by Z, a worldwide leading supplier of Y. We are expanding the core engineering team and we are looking for really passionate engineers who want to create their own story and help millions of people.

Can we find a time for a call to chat for a few minutes about this?

Thanks

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I just received an email from the first tutorial speaker, presenting me, saying he's ill and won't be

I know you have a lot to offer yourself to two presentations. Maybe you could increase your audience, maybe just offer time to try out what you've taught? Otherwise I have to do some kind of modern dance interpretation of Python in data :-)

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Can we find a time for a few minutes about this?

Thanks



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Andreas Mueller
June 6

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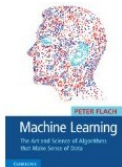
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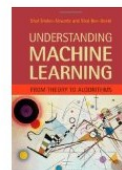
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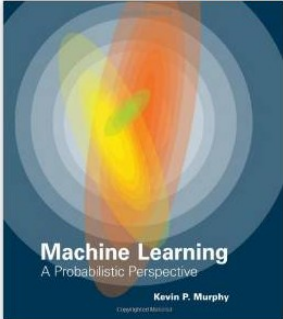
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Look inside



Today's Web-enabled deluge of electronic data calls for automated methods of data analysis. Machine learning provides these, developing methods that can automatically detect patterns in data and then use the uncovered patterns to predict future data. This textbook offers a comprehensive and self-contained introduction to the field of machine learning, based on a unified, probabilistic approach. The coverage combines breadth and depth, offering necessary background material on such topics as probability, optimization, and linear algebra as well as discussion of recent developments in the field, including conditional random fields, L1 regularization, and deep learning. The book is written in an informal, accessible style, complete with pseudo-code for the most important algorithms. All topics are copiously illustrated with color images and worked examples drawn from such application domains as

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Research Uses

- Astronomy (finding planets)
- Physics (detecting the Higgs boson)
- Medicine (predicting medicine efficacy)
- Politics (predicting elections)
- Linguistics (translation, part of speech tagging, parsing trees, language detection, ...)
- ...

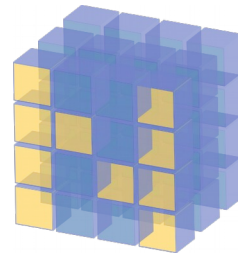


python

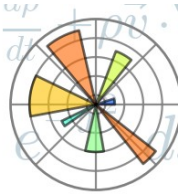
IP[y]: IPython
Interactive Computing



SciPy



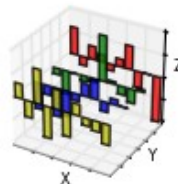
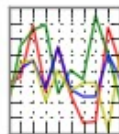
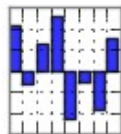
NumPy



matplotlib

pandas

$$y_{it} = \beta' x_{it} + \mu_i + \epsilon_{it}$$



IP[y]: IPython Interactive Computing

```
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IPy Chapter 4 - Workin...
127.0.0.1:8888/030923ca-af46-4fc6-86fc-1f0b18130e27#
DuckDuckGo
IP[y]: Notebook Chapter 4 - Working With Text Data. (autosaved)
File Edit View Insert Cell Kernel Help
Code Cell Toolbar: None

In [22]: from sklearn.svm import LinearSVC
svm = LinearSVC(C=0.01)

In [23]: svm.fit(X_train, y_train)

Out[23]: LinearSVC(C=0.01, class_weight=None, dual=True, fit_intercept=True,
intercept_scaling=1, loss='l2', multi_class='ovr', penalty='l2',
random_state=None, tol=0.0001, verbose=0)

In [24]: svm.score(X_train, y_train)

Out[24]: 0.88421586014694709

In [25]: svm.score(X_test, y_test)

Out[25]: 0.83679637325273892

In [26]: y_test_pred = svm.predict(X_test)

In [27]: from sklearn.metrics import classification_report

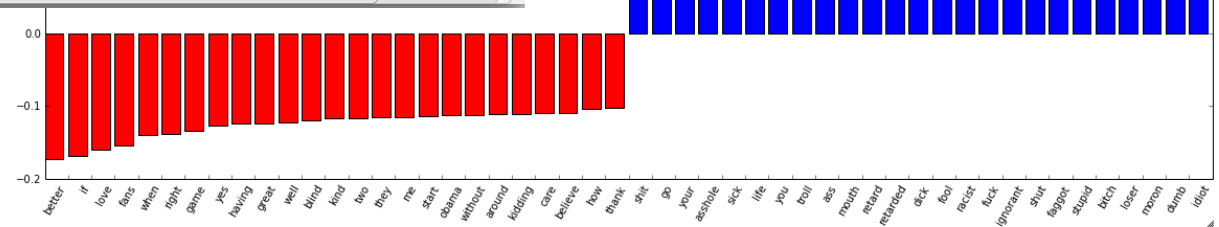
In [28]: print(classification_report(y_test, y_test_pred))

              precision    recall  f1-score   support

     0       0.84         0.96       0.90       1954
     1       0.82         0.48       0.61         693

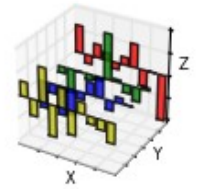
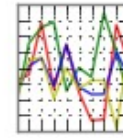
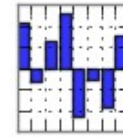
 avg / total       0.83         0.84       0.82       2647

In [29]: coef = svm.coef_.ravel()
positive_coefficients = np.argsort(coef)[-25:]
negative_coefficients = np.argsort(coef)[:25]
interesting_coefficients = np.hstack([negative_coefficients, positive_coefficients])
```



pandas

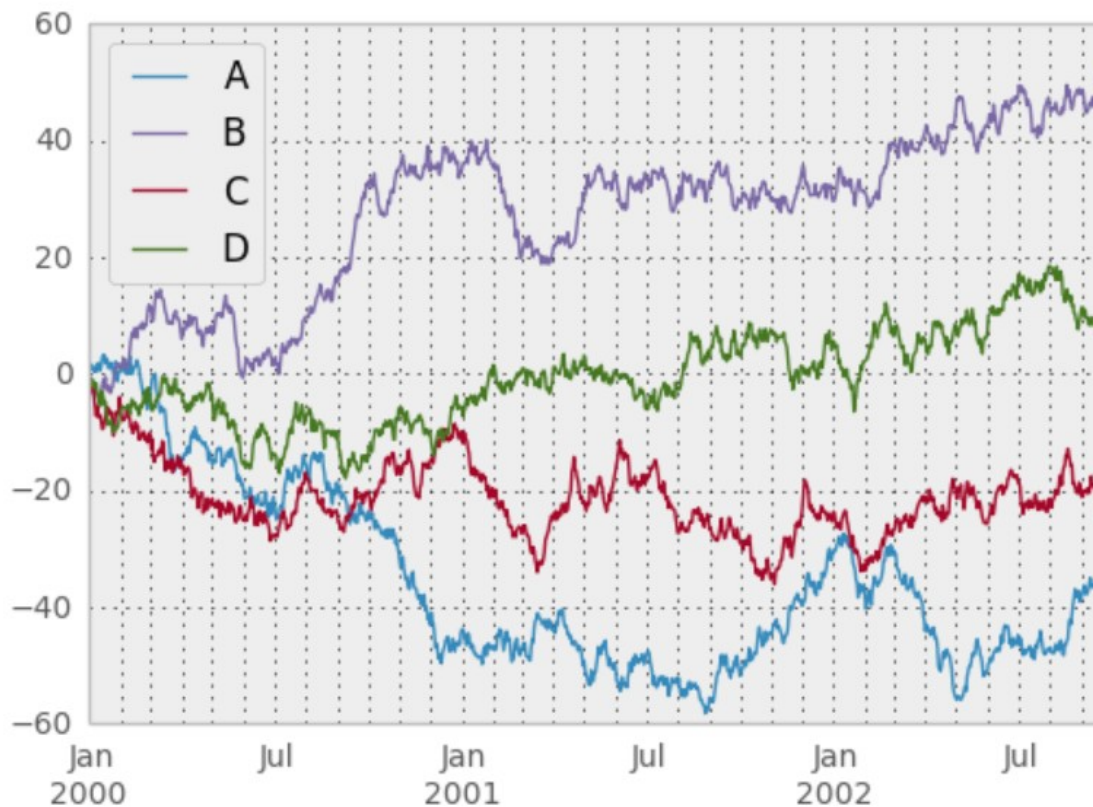
$$y_{it} = \beta' x_{it} + \mu_i + \epsilon_{it}$$

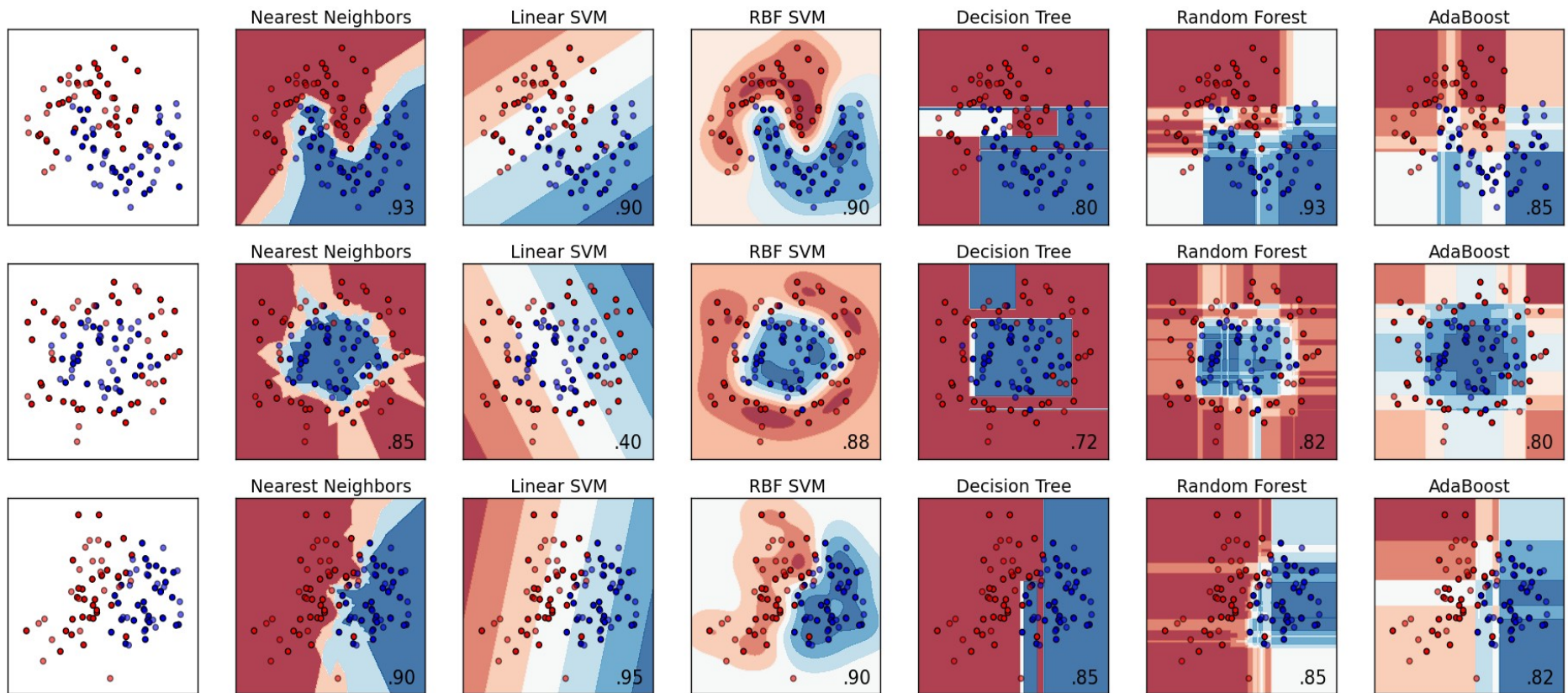


```
In [6]: df = DataFrame(randn(1000, 4), index=ts.index, columns=list('ABCD'))
```

```
In [7]: df = df.cumsum()
```

```
In [8]: plt.figure(); df.plot();
```





Kinds of Machine Learning

Supervised

- Classification
- Regression
- Ranking
- ...

Unsupervised

- Clustering
- Dimensionality Reduction
- ...

Representing Data

$$X = \begin{pmatrix} 1.1 & 2.2 & 3.4 & 5.6 & 1.0 \\ 6.7 & 0.5 & 0.4 & 2.6 & 1.6 \\ 2.4 & 9.3 & 7.3 & 6.4 & 2.8 \\ 1.5 & 0.0 & 4.3 & 8.3 & 3.4 \\ 0.5 & 3.5 & 8.1 & 3.6 & 4.6 \\ 5.1 & 9.7 & 3.5 & 7.9 & 5.1 \\ 3.7 & 7.8 & 2.6 & 3.2 & 6.3 \end{pmatrix}$$

Representing Data

one sample

$$X = \begin{pmatrix} 1.1 & 2.2 & 3.4 & 5.6 & 1.0 \\ 6.7 & 0.5 & 0.4 & 2.6 & 1.6 \\ 2.4 & 9.3 & 7.3 & 6.4 & 2.8 \\ 1.5 & 0.0 & 4.3 & 8.3 & 3.4 \\ 0.5 & 3.5 & 8.1 & 3.6 & 4.6 \\ 5.1 & 9.7 & 3.5 & 7.9 & 5.1 \\ 3.7 & 7.8 & 2.6 & 3.2 & 6.3 \end{pmatrix}$$

Representing Data

one sample

$X =$

1.1	2.2	3.4	5.6	1.0
6.7	0.5	0.4	2.6	1.6
2.4	9.3	7.3	6.4	2.8
1.5	0.0	4.3	8.3	3.4
0.5	3.5	8.1	3.6	4.6
5.1	9.7	3.5	7.9	5.1
3.7	7.8	2.6	3.2	6.3

one feature

Representing Data

one sample

$$X = \begin{pmatrix} 1.1 & 2.2 & 3.4 & 5.6 & 1.0 \\ 6.7 & 0.5 & 0.4 & 2.6 & 1.6 \\ 2.4 & 9.3 & 7.3 & 6.4 & 2.8 \\ 1.5 & 0.0 & 4.3 & 8.3 & 3.4 \\ 0.5 & 3.5 & 8.1 & 3.6 & 4.6 \\ 5.1 & 9.7 & 3.5 & 7.9 & 5.1 \\ 3.7 & 7.8 & 2.6 & 3.2 & 6.3 \end{pmatrix}$$

one feature

$$y = \begin{pmatrix} 1.6 \\ 2.7 \\ 4.4 \\ 0.5 \\ 0.2 \\ 5.6 \\ 6.7 \end{pmatrix}$$

outputs / labels

Training and Testing Data

$$X = \begin{pmatrix} 1.1 & 2.2 & 3.4 & 5.6 & 1.0 \\ 6.7 & 0.5 & 0.4 & 2.6 & 1.6 \\ 2.4 & 9.3 & 7.3 & 6.4 & 2.8 \\ 1.5 & 0.0 & 4.3 & 8.3 & 3.4 \\ 0.5 & 3.5 & 8.1 & 3.6 & 4.6 \\ 5.1 & 9.7 & 3.5 & 7.9 & 5.1 \\ 3.7 & 7.8 & 2.6 & 3.2 & 6.3 \end{pmatrix} \quad y = \begin{pmatrix} 1.6 \\ 2.7 \\ 4.4 \\ 0.5 \\ 0.2 \\ 5.6 \\ 6.7 \end{pmatrix}$$

Training and Testing Data

training set

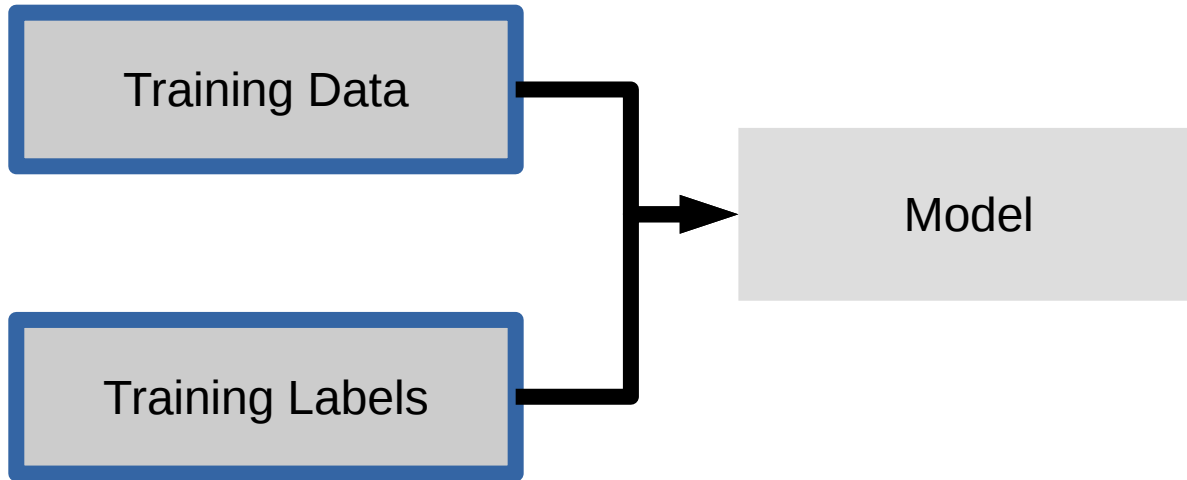
$$X = \begin{pmatrix} 1.1 & 2.2 & 3.4 & 5.6 & 1.0 \\ 6.7 & 0.5 & 0.4 & 2.6 & 1.6 \\ 2.4 & 9.3 & 7.3 & 6.4 & 2.8 \\ 1.5 & 0.0 & 4.3 & 8.3 & 3.4 \\ 0.5 & 3.5 & 8.1 & 3.6 & 4.6 \\ 5.1 & 9.7 & 3.5 & 7.9 & 5.1 \\ 3.7 & 7.8 & 2.6 & 3.2 & 6.3 \end{pmatrix}$$

test set

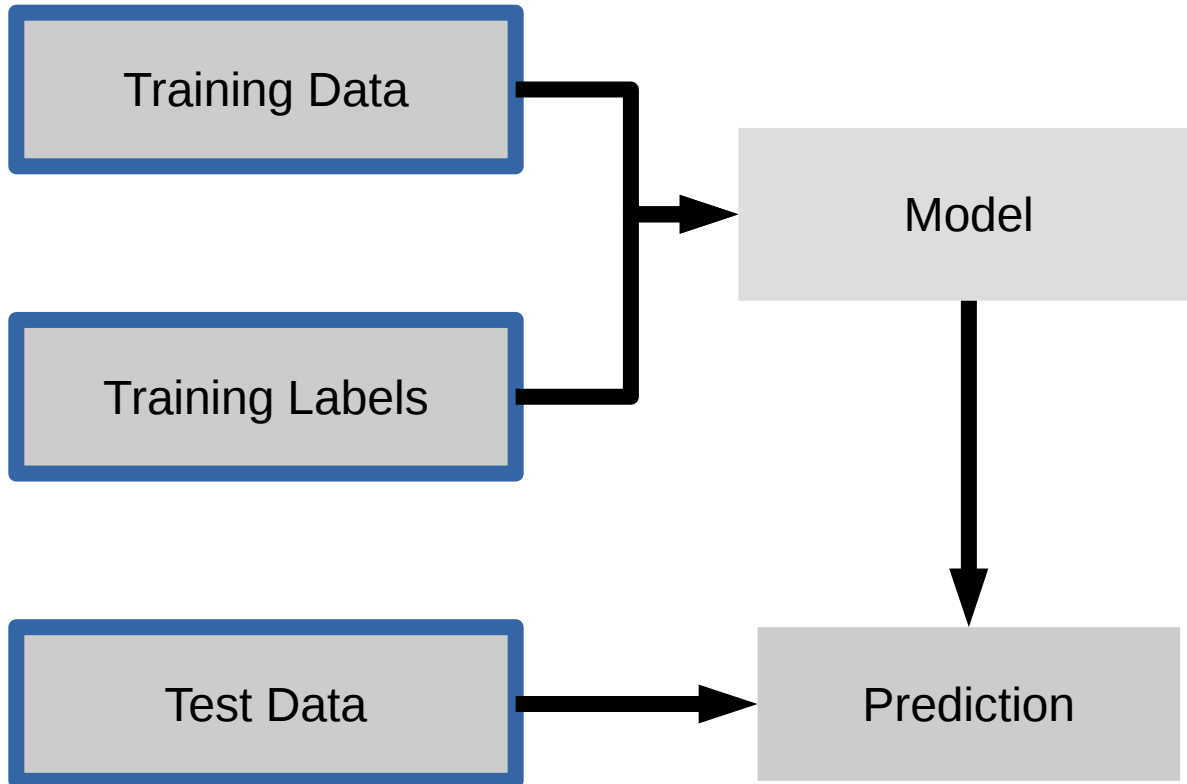
$$y = \begin{pmatrix} 1.6 \\ 2.7 \\ 4.4 \\ 0.5 \\ 0.2 \\ 5.6 \\ 6.7 \end{pmatrix}$$

IPython Notebook: Part 0 – Data Loading

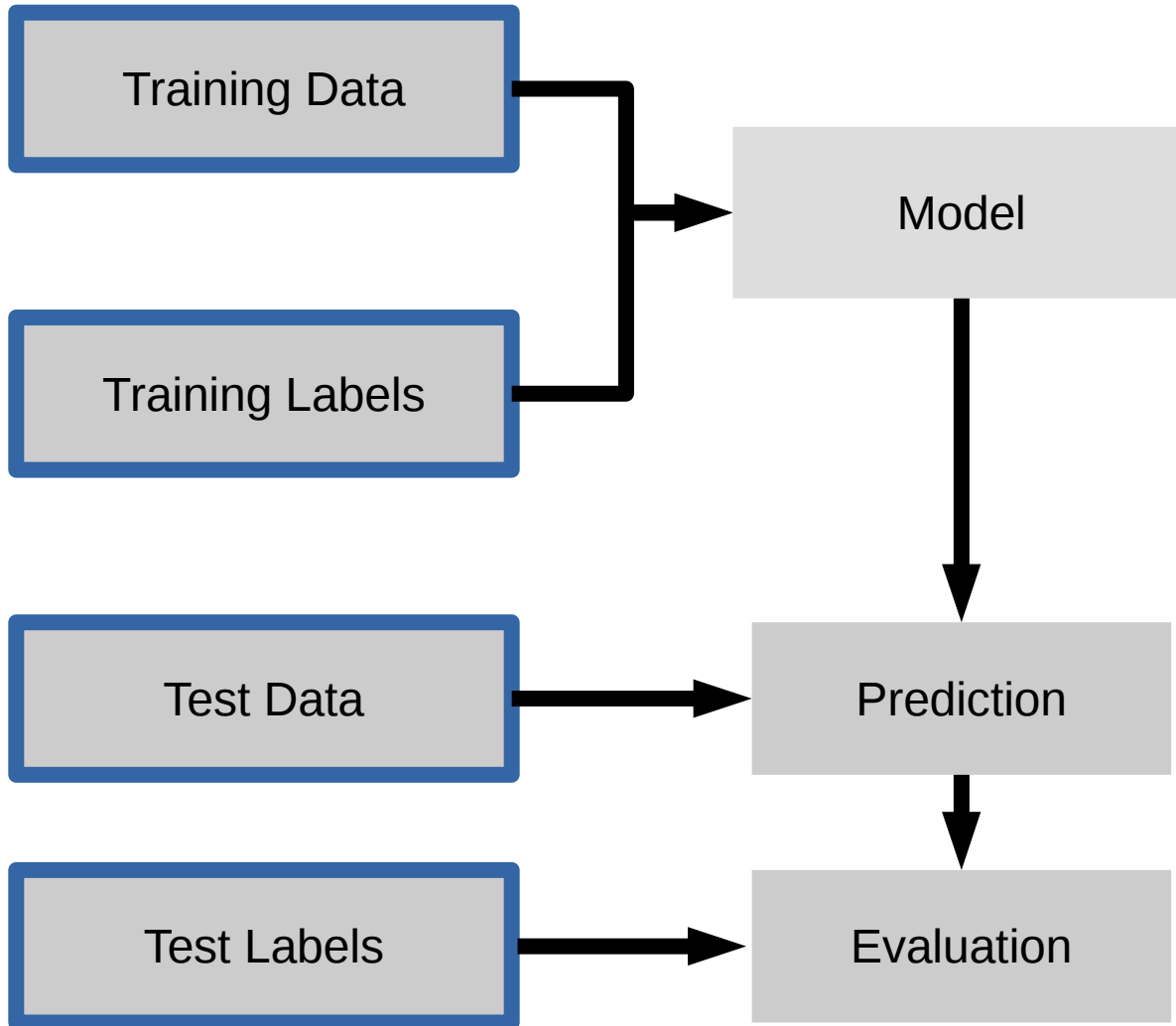
Supervised Machine Learning



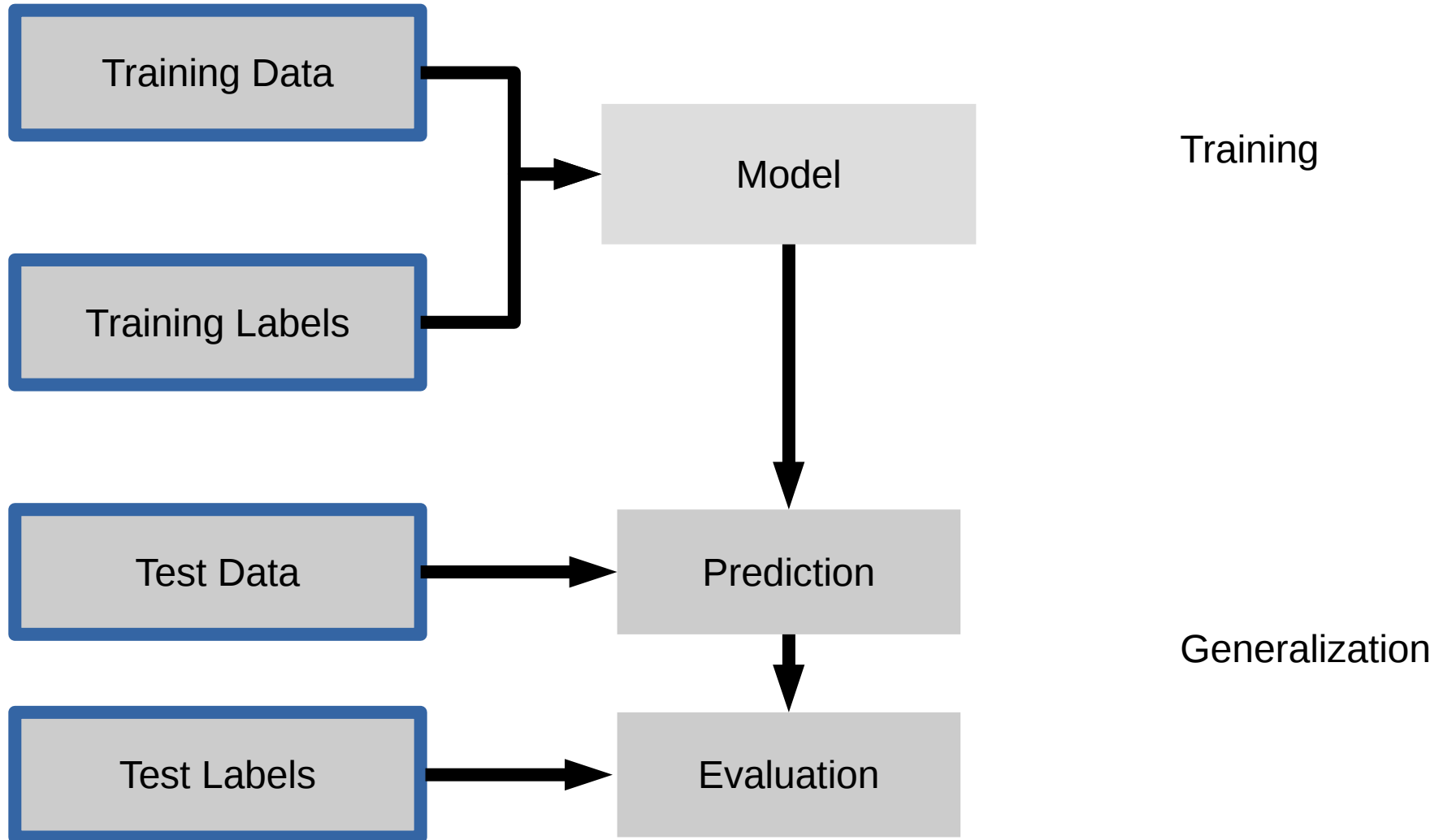
Supervised Machine Learning



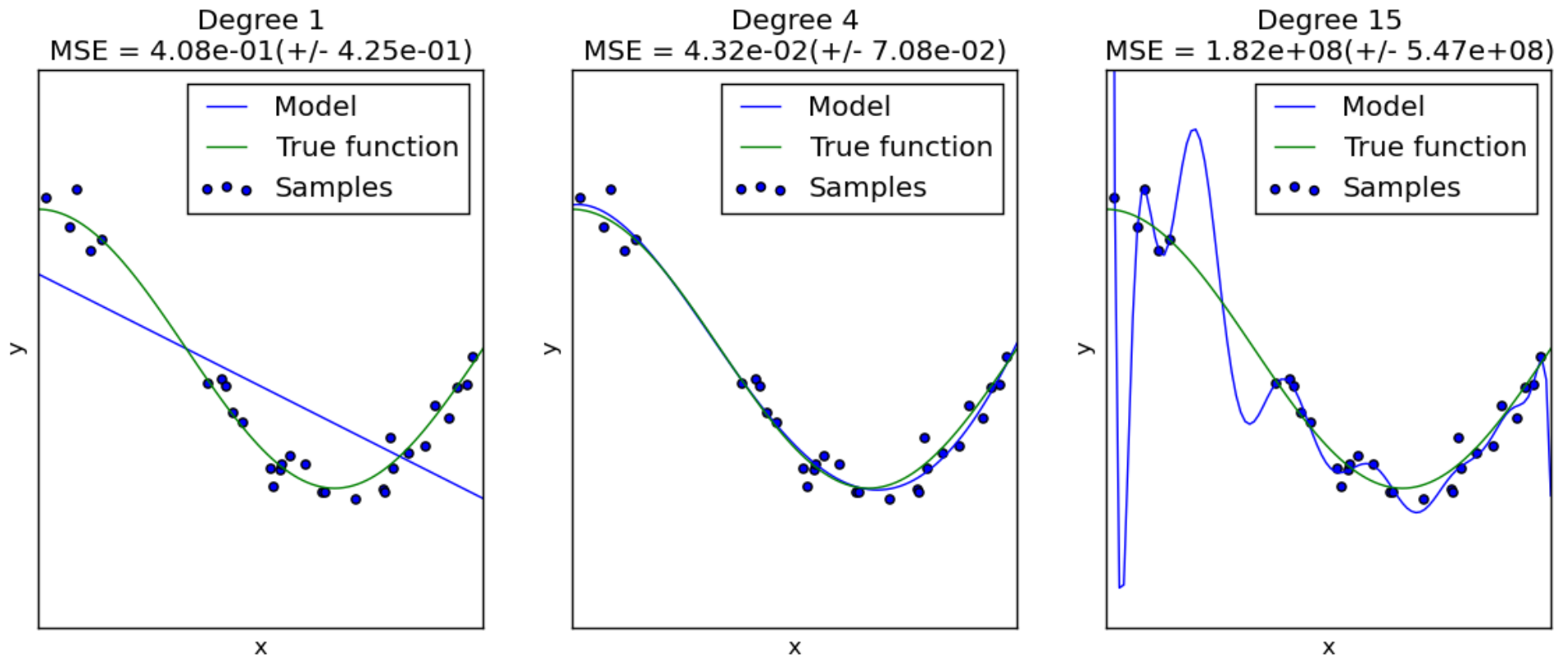
Supervised Machine Learning



Supervised Machine Learning



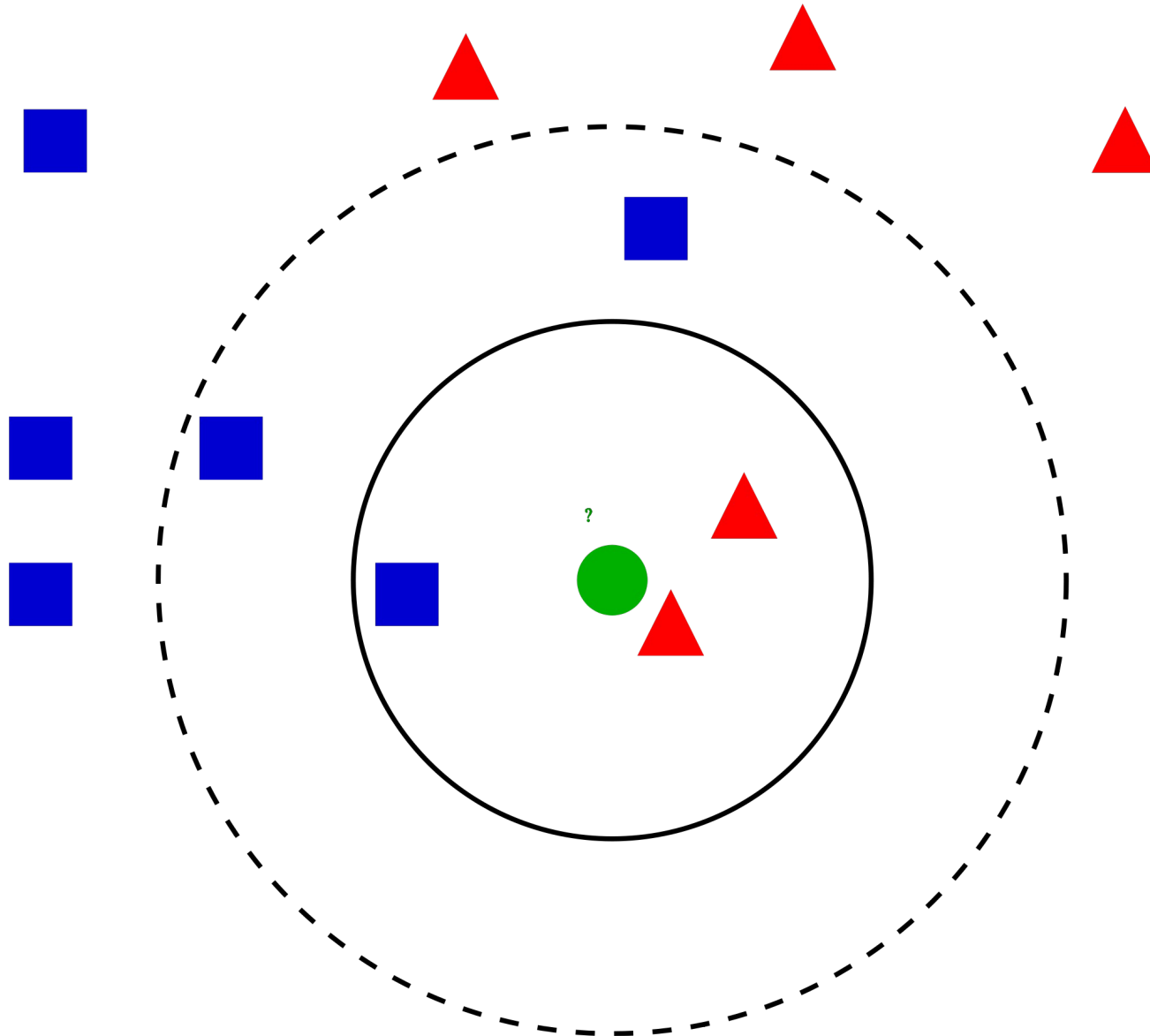
Fitting Polynomials of Varying Degrees



Let's see some algorithms

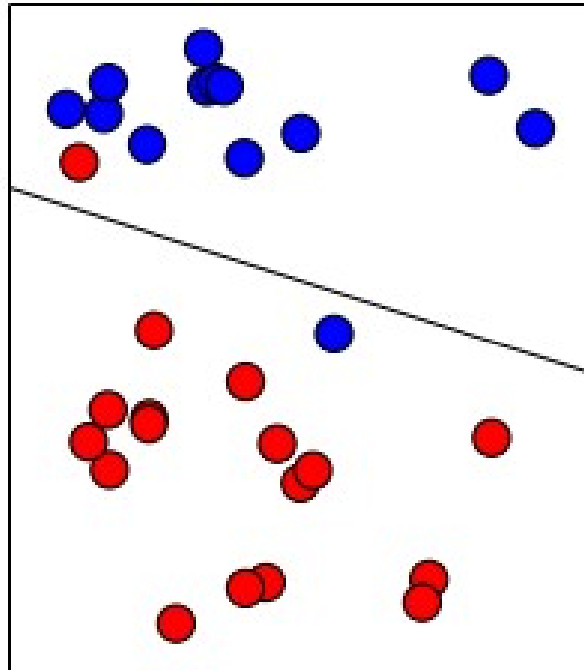
Classification

K Nearest Neighbors



Logistic Regression

$$\hat{y} = w_0 + \sum_i w_i x_i > 0$$



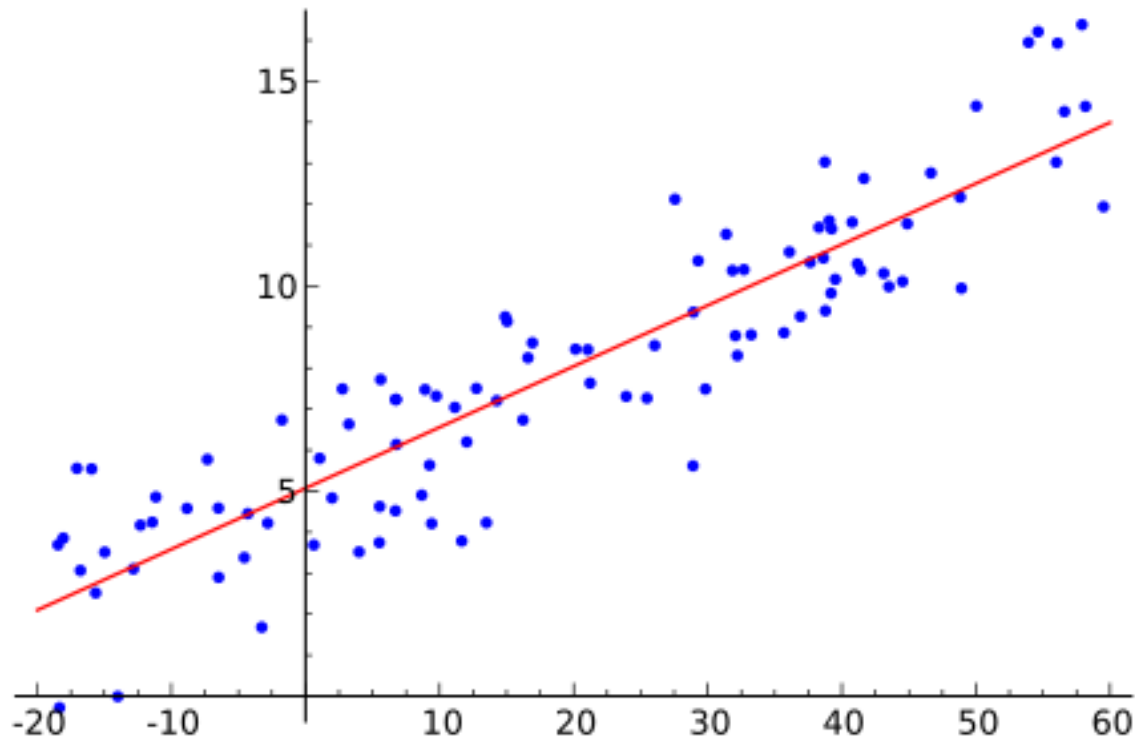
IPython Notebook:

1 Classification

Regression

Linear Regression

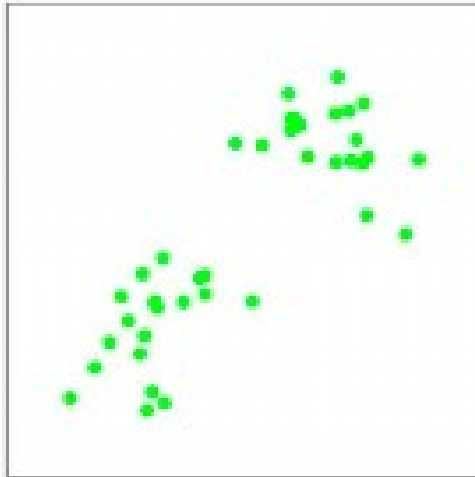
$$\hat{y} = w_0 + \sum_i w_i x_i$$



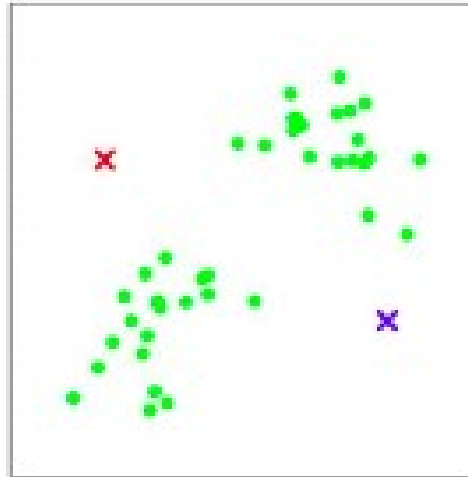
IPython Notebook: 2 Regression

Clustering

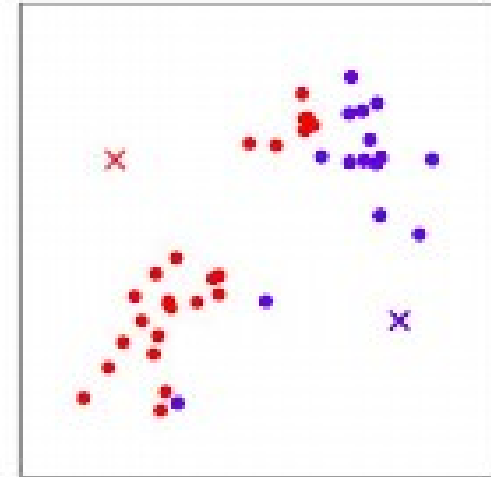
K Means



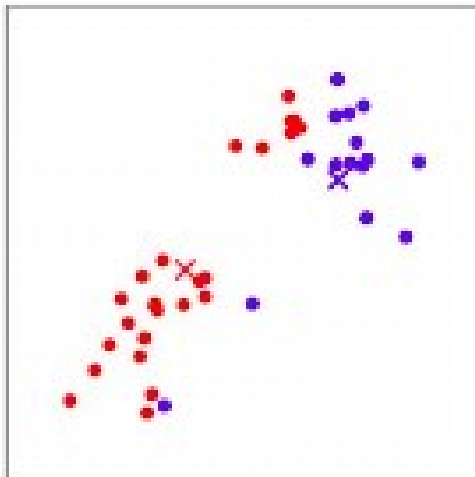
(a)



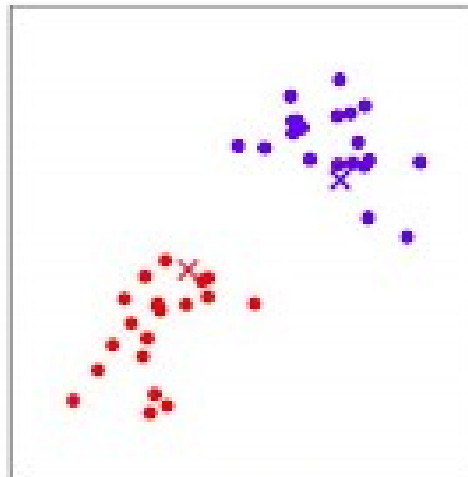
(b)



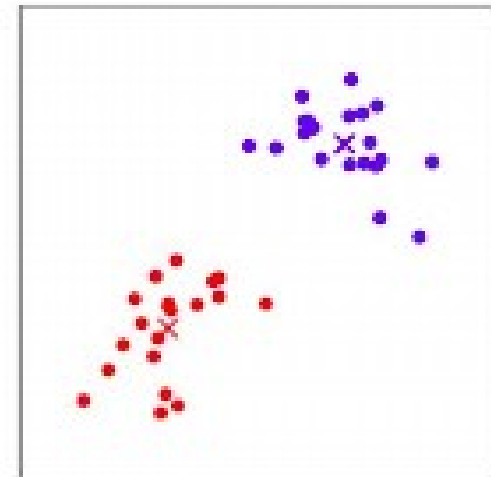
(c)



(d)



(e)



(f)

IPython Notebook: 3 Clustering

Sample application: Sentiment Analysis

IMDB Movie Reviews Data

Review:

One of the worst movies I've ever rented. Sorry it had one of my favorite actors on it (Travolta) in a nonsense role. In fact, anything made sense in this movie.

Who can say there was true love between Eddy and Maureen?
Don't you remember the beginning of the movie ?

Is she so lovely? Ask her daughters. I don't think so.

Label: negative

Training data: 12500 positive, 12500 negative

Bag Of Word Representations

`CountVectorizer / TfidfVectorizer`

Bag Of Word Representations

`CountVectorizer / TfidfVectorizer`

`"This is how you get ants."`

Bag Of Word Representations

CountVectorizer / TfidfVectorizer

"This is how you get ants."

tokenizer

↓
['this', 'is', 'how', 'you', 'get', 'ants']

Bag Of Word Representations

CountVectorizer / TfidfVectorizer

"This is how you get ants."

tokenizer

↓
['this', 'is', 'how', 'you', 'get', 'ants']

↓
Build a vocabulary over all documents

↓
['aardvak', 'amsterdam', 'ants', ... 'you', 'your', 'zyxst']

Bag Of Word Representations

CountVectorizer / TfidfVectorizer

"This is how you get ants."

tokenizer

['this', 'is', 'how', 'you', 'get', 'ants']

Build a vocabulary over all documents

['aardvak', 'amsterdam', 'ants', ... 'you', 'your', 'zyxst']

Sparse matrix encoding

aardvak	ants	get	you	zyxst
[0, ..., 0, 1, 0, ... , 0, 1 , 0, ..., 0, 1, 0,	0]			

N-grams (unigrams and bigrams)

`CountVectorizer / TfidfVectorizer`

N-grams (unigrams and bigrams)

`CountVectorizer / TfidfVectorizer`

`"This is how you get ants."`

N-grams (unigrams and bigrams)

`CountVectorizer` / `TfidfVectorizer`

"This is how you get ants."

Unigram tokenizer



`['this', 'is', 'how', 'you', 'get', 'ants']`

N-grams (unigrams and bigrams)

CountVectorizer / TfidfVectorizer

"This is how you get ants."

Unigram tokenizer

↓
['this', 'is', 'how', 'you', 'get', 'ants']

"This is how you get ants."

Bigram tokenizer

↓
['this is', 'is how', 'how you', 'you get', 'get ants']

IPython Notebook:

4 Working With Text Data

Video Series

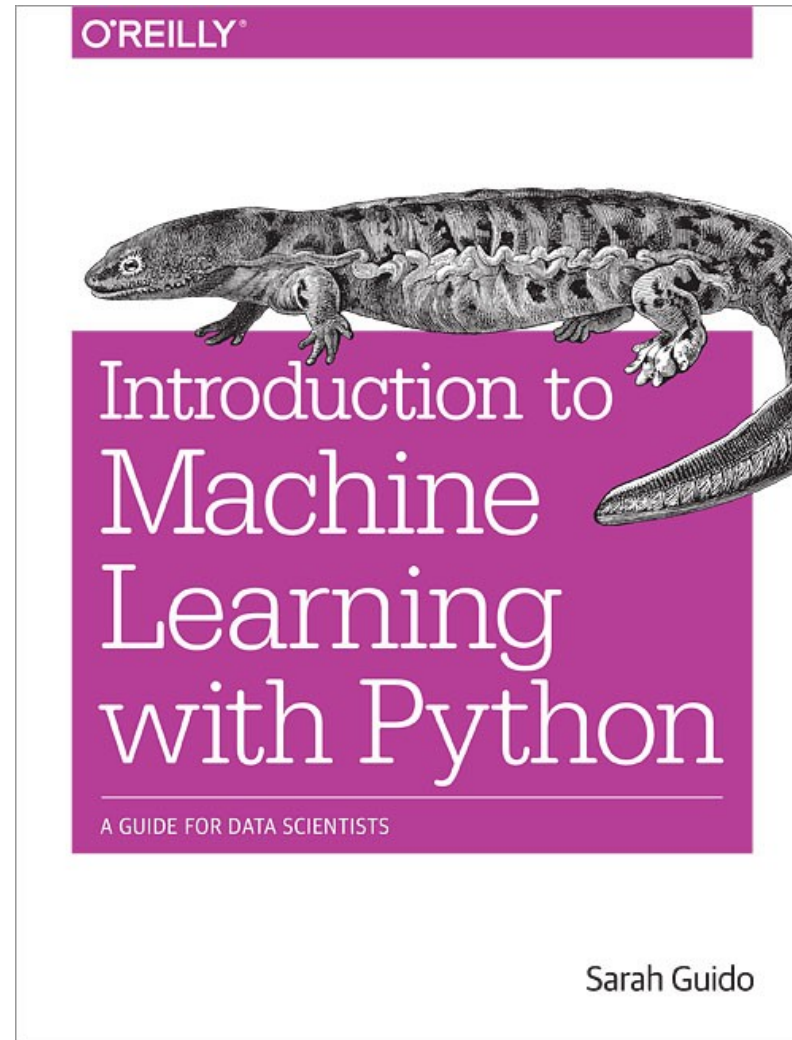
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Thank you for your attention.



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