## MSML 605

Introduction

## Administration

- Course webpage
- Get homework assignments
http://www.cs.umd.edu/~nayeem/courses/MSML605/
- Syllabus
- Other documents
- Piazza
- Ask questions
" Do not post solutions
- Do not ask if your answer or approach is correct
- Discuss issues
- Public versus Private
- ELMS
" Submit homework / assignments
- See grades.


## Administration (contd.)

- References
- There is no specific textbook for this class.
- We will be posting links to any references covered in class.
- Homework / Assignments
- Regular homework and programming assignment.
" Late date: 20\% off your actual grade. ( one get-out-of-jail-free card).


## Components of the course

- Quizzes:
"are you with us?" not worth many points but useful finger on the pulse (for you and me)
- Tests:
"what have you learned?" Important checkpoints!!
- Programming assignments :
"can you implement it?"


## Administration (contd.)

- Exams
- One midterm : April 9 in lecture.
- Final exam: May 14 in lecture.
- Grading
- Quiz: 1\% for each quiz
- Midterm: 20\%
- Assignments: 30\%
- Final: 30-35\%
- Academic integrity


## Topics (tentative)

- Introduction
- Python programming
- Numpy, Scipy
- Matplotlib
- Pandas
- Stats library
- Github
- Database connectivity
- Tensorflow
- Hardware for Machine learning


## Introduction to Machine Learning


source: https://xkcd.com/1838/

## Introduction

## What is Machine Learning?

Learn from experience


Learn from experience


Follow instructions


## Data Genc Domo

## DATA NEVER SLEEPS 7.0

How much data is generated every minute?
 edtion of Data Neerer Sleeps we mring you the latest tsats on how much data is beng created in every digtal minute - and the numbers are stagsering.


## Data Generated 

IBM Consumer Products Industry Blog

## Industry Insights

## 2.5 quintillion bytes of data created every day. How does CPG \& Retail manage it?

2.5 quintillions of data is generated per day

1 quintillion = 1,000,000,000,000 Million
= 1 Billion Billion

## Scenarios

- Banks are building up pictures of how people spend their money,
- hospitals are recording what treatment patients are on for which ailments and how they respond.
- Engine monitoring systems are recording information about the engine.

The challenge is to do something useful with this data

## Scenarios

- Enormous amount of biological data is available today, such as gene expression, protein transcription data and phylogenetic trees relating species to each other, etc.
- Around terabyte of data is collected every night in the form of Data collected from telescopes around the world.
- Medical science stores outcomes of medical tests from measurements such as MRI scans and simple blood tests.

The explosion of stored data is well known; the challenge is to do something useful with it.

## Machine Learning Scenarios

- If the bank's computers can learn about spending patterns, can they detect credit card fraud quickly?
- If hospitals share data, then can treatments that don't work as well as expected be identified quickly?
- Can an intelligent car give you early warnings of problems, so that you don't end up stranded?


## ML Interaction



## ML Interaction

- You have already interacted with machine learning algorithms at some time.
- Spam filters
- Voice recognition
- Computer games
- Automatic license plate recognition on toll roads
- Recommendations by Amazon and Netflix

Different ML Algorithms

- Supervised Learning: Learning from exemplars
- Unsupervised Learning: labels are not provided
- Reinforcement Learning:Somewhere between supervised and unsupervised learning.


## Supervised Learning - Classification

Training Data

cat
cat
cat
Test Image



dog
dog
dog

## House Prices - Regression

| Price (in 1000\$) | Area(sq. ft.) | \# Bathrooms | \# Bedroom |  |
| :---: | :---: | :---: | :---: | :---: |
| 220 | 1600 | 2.5 | 3 |  |
| yi 180 | 1400 | 1.5 | 3 |  |
| 350 | 2100 | 3.5 | 4 |  |
| ... | ... | ... | $\ldots$ |  |
|  |  | $\cdots$ |  |  |
| 500 | 2400 | 4 | 5 | 1400 |
|  |  |  |  | 1.5 |
| 1850 |  |  | $x^{(i)}$ | 3 |
| X test 2.5 | $y ?$ |  |  |  |
| 3 |  |  |  |  |

## Unsupervised Learning

Training Data


## Test Document



## Reinforcement Learning

from state s, action a


## ML Approach

- Collect data


Remember Mr Pooter is not just a 'patient', he's an important source of valuable and readily marketable data!

## ML Approach

- Clean that data prepare it for analysis



## ML Approach

- Visualize / analyze data

"After closer investigation, it's become clear that we need to enter more than one value."


## Training \& Testing



## ML Approach

- The steps involved in the development of a machine learning application involves:
- Collect data
- Prepare the input data
- Analyze the input data
- Train the algorithm
- Test the algorithm
- Predict


## Datasets

https://www.data.gov/

- US-centric agriculture, climate, education, energy, finance, health, manufacturing data, ...
https://cloud.google.com/bigquery/public-data/
- BigQuery (Google Cloud) public datasets (bikeshare, GitHub, Hacker News, Form 990 non-profits, NOAA, ...)
https://www.kaggle.com/datasets
- Microsoft-owned, various (Billboard Top 100 lyrics, credit card fraud, crime in Chicago, global terrorism, world happiness, ...)
https://aws.amazon.com/public-datasets/
- AWS-hosted, various (NASA, a bunch of genome stuff, Google Books ngrams, Multimedia Commons, ...)

Some Technologies we will use


pandas
$y_{i t}=\beta^{\prime} x_{i t}+\mu_{i}+\epsilon_{i t}$

learn

## Data - Example

| Outlook | Temperature | Humidity | Windy | Play |
| :--- | :--- | :--- | :--- | :--- |
| Sunny | hot | high | false | no |
| Sunny | hot | high | true | no |
| Overcast | hot | high | false | yes |
| Rainy | mild | high | false | yes |
| Rainy | cool | normal | false | yes |
| Rainy | cool | normal | true | no |
| Overcast | cool | normal | true | yes |
| Sunny | mild | high | false | no |
| Sunny | cool | normal | false | yes |
| Rainy | mild | normal | false | yes |
| Sunny | mild | normal | true | yes |
| Overcast | mild | high | true | yes |
| Overcast | hot | normal | false | yes |
| Rainy | mild | high | true | no |

## Sparse Data

- Most of the attributes have a value of 0 for most of the instances.
- For example, items purchased in a store is zero for most of the items.
- The data matrix with rows as customers and columns as items, is sparse.


## Sparse Data

Items


## Missing Values

- Missing values are frequently indicated by out-of-range entries, for example,
- negative numbers that is normally only positive
- a 0 in a numeric field that can never be normally 0
- missing values may also be indicated by blanks and dashes.


## Normalization

- Attributes are often normalized to lie in a fixed range usually from 0 to 1 , for example
- dividing all the values by the maximum value encountered, or
- by subtracting the minimum value and dividing by the range between the maximum and minimum values.


## Normalization

- Another normalization technique is to:
- calculate the statistical mean and the standard deviation of the attribute values,
- then subtract the mean from each value, and,
- divide the result by the standard deviation.
- This process is called standardizing a statistical variable.
- It results into a set of values whose mean is 0 and the standard deviation is 1 .


## K-Nearest Neighbor Classification




## BUT FIRST, SNAKES!

Python is an interpreted, dynamically-typed, high-level, garbage-collected, object-oriented-functional-imperative, and widely used scripting language.

- Interpreted: instructions executed without being compiled into (virtual) machine instructions*
- Dynamically-typed: verifies type safety at runtime
- High-level: abstracted away from the raw metal and kernel
- Garbage-collected: memory management is automated
- OOFI: you can do bits of OO, F, and I programming

Not the point of this class!

- Python is fast (developer time), intuitive, and used in industry!


## THE ZEN OF PYTHON

- Beautiful is better than ugly.
- Explicit is better than implicit.
- Simple is better than complex.
- Complex is better than complicated.

- Flat is better than nested.
- Sparse is better than dense.
- Readability counts.
- Special cases aren't special enough to break the rules ...
- ... although practicality beats purity.
- Errors should never pass silently ...
- ... unless explicitly silenced.


## LITERATE <br> PROGRAMMING

Literate code contains in one document:

- the source code;
- text explanation of the code; and

- the end result of running the code.

Basic idea: present code in the order that logic and flow of human thoughts demand, not the machine-needed ordering

- Necessary for data science!
- Many choices made need textual explanation, ditto results. Stuff you'll be using in Project 1 (and beyond)!


## Interpreter

- Reads a program line and executes it



## Compiler

- Reads a program completely, translates it into executable code and then executes



## Program

- A sequence of instructions in a particular language.
* The details will be different in different languages.
- In every program, there is an input, an output
- In between there are some mathematical operations, or conditional execution and also repetition.


## Debugging

- There will always be bugs.
- Process of tracking down the bugs is called debugging.
- There are three types of errors:
- Syntax errors
- Runtime errors, also called exceptions
- Semantic errors - the meaning of the program is wrong (for example using \% instead of / for floating point division)


## Variables, Expressions and Statements

## Values

- A basic unit of a program

Types:
" integers

- strings
- float
- complex


## Variables

- A powerful feature of a programming language.
- A variable refers to a value.
- An assignment operator creates a new variable and assigns a value

4509828488 5

4509828488
4454993376

y

4454993376

## Variable Names and Keywords

- Variable names can be both letters and numbers.
- They have to begin with a letter though.
- Uppercase letters are allowed, generally we use lowercase variable names.
- Underscore character, _ , can also appear in a name.
- An illegal name results in a syntax error.


## PYTHON 2 VS 3

Python 3 is intentionally backwards incompatible

- (But not that incompatible)

Biggest changes that matter for us:

- print "statement" $\rightarrow$ print("function")
- $1 / 2=0$
- ASCII str default $\quad \rightarrow$ default Unicode

Namespace ambiguity fixed:

$$
\begin{aligned}
& i=1 \\
& \text { [i for i in range(5)] } \\
& \text { print(i) \# ???????? }
\end{aligned}
$$

## TO ANY CURMUDGEONS

If you're going to use Python 2 anyway, use the _future_ module:

- Python 3 introduces features that will throw runtime errors in Python 2 (e.g., with statements)
- _future_ module incrementally brings 3 functionality into 2
- https://docs.python.org/2/library/__future__.html
from _future_ import division
from _future_ import print_function
from _future_ import please_just_use_python_3

Operators and operands

- Operators represent computations like addition, multiplication, division etc.
*, -, +, / and **
- The values the operator is applied to are called operands.


## Expressions and Statements

- An expression is a combination of values, variables, and operators.
- A value all by itself is also an expression
- Variable is also an expression for e.g.,
21
x
$x+21$
- A statement is a unit of code that a Python interpreter can execute. e.g., print, and assignment


## Order of Operations

- When more than one operator appears in an expression, the order of evaluation depends on the rules of precedence.
- The acronym of precedence is PEMDAS
- Parentheses (1+1)**(5-3)
- Exponentiation, 2**1+1
- Multiplication and Division have the same precedence,
- Addition and subtraction have the same precedence
- Operators with the same precedence are evaluated from left to right (except exponentiation) for e.g., $2 / 5^{*} 3$.


## String Operations

- You can't perform mathematical operations on strings.
'2' - '1' 'eggs'/'dozens'
- The '+' operator works with strings and performs concatenation.
first = "hello"
second = "Class"
print(first + second)
- The output is "helloclass"


## String Operations

- The '*' operator works with strings and performs repetition. 'Spam’*3 is 'SpamSpamSpam'
- If one of the operands is a string, the other has to be an integer.


## Comments

- As programs get bigger and more complicated, they get more difficult to read.
- It is a good idea to add notes to your programs.
- The comments start with \# symbol

Functions

## Function as a Black Box

$$
\begin{gathered}
\text { def } f 0 o(a, b): \\
c=a+b \\
\text { return } c
\end{gathered}
$$


encapsulation- information hiding
m= foo(d,e)

## Functions

- A named sequence of statements that perform a certain computation.
- Later on, you can call the function by name
- for example, type(34)


## Why Functions?

- A group of statements gets a name
- Modular code
- Easier Debugging
- Code Reuse


## Type Conversion Functions

* There are built-in functions in Python that convert from one type to another.
* The int function takes any value and converts it to an integer.
- int function takes any value and converts it to an integer, if it can.
- int can convert floating-point values to integers, but it doesn't round off. It chops off the fraction part.

Type Conversion

- float converts integers and strings to floatingpoint numbers
- str converts its arguments to string

Math Functions

- Python has a math module that provides mathematical functions.
- Before we can use the module, we have to import it: import math
- This module contains the functions and variables defined in the module.
- To access one of the functions, you have to specify the name of the module and the name of the function.


## USEFUL BUILT-IN FUNCTIONS: COUNTING AND ITERATING

len: returns the number of items of an enumerable object

```
len( ['C', 'm', 's', 'c', 3, 2, 0] )
```

7
range: returns an iterable object
list( range(10) )
$[0,1,2,3,4,5,6,7,8,9]$
enumerate: returns iterable tuple (index, element) of a list

$$
\begin{aligned}
& \text { enumerate( ["311", "320", "330"]) } \\
& {[(0, " 311 "),(1, " 320 "),(2, " 330 ")]}
\end{aligned}
$$

## USEFUL BUILT-IN FUNCTIONS: MAP AND FILTER

map: apply a function to a sequence or iterable

```
arr = [1, 2, 3, 4, 5]
map(lambda x: x**2, arr)
```

$[1,4,9,16,25]$
filter: returns a list of elements for which a predicate is true

```
arr = [1, 2, 3, 4, 5, 6, 7]
filter(lambda x: x % 2 == 0, arr)
```

$[2,4,6]$
We'll go over in much greater depth with pandas/numpy.

## User defined Functions

- Use keyword def
def message():
print("Hello Class")


## Flow of Execution

- The program flow
- Follow the flow of execution.

Parameters and Arguments

- Some built-in functions require arguments.
- for example , math functions
- Inside the function, arguments are assigned to variables called parameters.
- An expression can also be used as an argument.


## Variables and parameters

- A variable created inside a function is local.
- Parameters are also local
- Some functions return a value and others are void which return nothing.


## Import

- Python provides two ways to import modules
- We have already seen import math
- We can also import functions using from


## Code

def summation( $x, y$ ): sum $=x+y$ print(sum)
summation (2,4)
$x=2$
$y=4$

```
def summation(x,y):
    z = x + y
    return(z)
print(summation(2,4))
def summation(x,y):
    z = X + y
    return(z)
```

$m=\operatorname{summation}(2,4)$
print(m)

## Conditionals

## Import

- Python provides two ways to import modules
- We have already seen import math
- We can also import functions using from


## Modulus Operator

- Modulus operator works on integers.
- It yields a remainder when the first operator is divided by the second.
- Modulus operator is a percent sign (\%)
- quotient = 7 // 3
- remainder = 7\%3


## Modulus Operator

- Usefulness of modulus operator?


## Modulus Operator

## Usefulness of modulus operator?

If I ask you to find the last digit of a number or more.

$$
\begin{aligned}
& 97856 \div 100 \\
& 56
\end{aligned}
$$

## Boolean Expressions

- A boolean expression is an expression that is either true or false.
- It uses the operator ' $==$ ', which compares the operands to the left and the right of this operator
- It produces either True or False
for example, $5==5$ will return True and $5==6$ will return False
- True and False are of type bool


## Other relational Operators

- $x$ != $y$
- $x>y$
- $x<y$
- $x>=y$
- $x<=y$
$x=y$
\# $x$ is not equal to $y$
$\# x$ is greater than $y$
\# $x$ is less than $y$
\# $x$ is greater than or equal to $y$ \# $x$ is less than or equal to $y$


## Logical Operators

- Three logical operators: and, or, and not for example,
- x > 0 and $x<10$

This is true only if x is greater than 0 and less than 10

- $\mathrm{n} \% 2==0$ or $\mathrm{n} \% 3==0$ is true if either of the conditions is true, that is, if the number is divisible by 2 or 3 .
- The not operator negates a boolean expression, so $\operatorname{not}(x>y)$ is true if $x>y$ is false, that is, if $x$ is less than or equal to $y$.


## Conditional Execution

- We need to check conditions and change the behavior of the program
- The simplest conditional statement is if, for example

```
if x>0:
    print('x is positive')
x is positive
```

- The boolean expression after 'if' is called the condition.
def decide(x,y):
def decide(x,y):
if x=='green' and y=='Red':
if x=='green' and y=='Red':
print("You can go!")
print("You can go!")
y = 'Red'
y = 'green'
y = 'green'
z = 'Red'
decide(z,y)



## if condition

- If statements have the same structure as function definitions: a header followed by an indented body.
- Statements like these are called compound statements.
- There is no limit on the number of statements that can appear in the body, but there has to be at least one.


## if condition

- Sometimes it is useful to have a body with no statements, usually as a place holder
- In that case use the pass statement, which does nothing
if $x<0$ : pass \# need to handle negative values


## Alternative execution

- When there are two possibilities and the condition determines which one gets executed

```
if x%2 == 0:
    print('x is even')
else:
    print('}x\mathrm{ is odd')
```

" The alternatives are called branches, because they are branches in the flow of execution.

## Chained Conditionals

- Sometimes there are more than two possibilities and we need more than two branches.
- One way to express a computation like that is a chained conditional:

```
if(x < y):
    print('x is less than y')
elif (x > y):
    print('x is greater than y')
else:
    print('x and y are equal')
```

elif is an abbreviation of "else if"

## Chained Conditionals

- There is no limit to the number of elif statements.
- If there is an else clause, it has to be at the end.
- We don't need an else statement

```
if choice == 'a':
    draw_a()
elif choice == 'b':
    draw_b()
elif choice == 'c':
    draw_c()
```

- Each condition is checked in order. If the first one is false, the next is checked, and so on.

Iterations

## Iterations

- It involves repetition.
" A statement or a group of statements that need to be repeated.
- Help in automation of repetitive tasks.


## for statement

- A 'for' statement requires an iterator and starts with the keyword 'for'


```
for i in range(10):
    print(i)
```

This iteration will start with a 0 and the last number is not included

## for statement with a range

- 'for' statement can be used to display a specific range of numbers
range from 40 to 49

```
for i in range(40,50):
    print(i)
```

- This iteration will start with 40 and the last number is not included


## for statement with a range and steps

- 'for' statement can be used to display a specific range of numbers in different steps
numbers from 40 to 49 in steps of 2

```
for i in range(40,50,2):
    print(i)
```

- This iteration will start with 40 and the last number is not included


## while statement

- It requires a condition, for e.g;

```
n=12
while(n>0):
    print(n)
```

- In the definition there is no starting iterator.
- We need to use a condition inside while


# while statement with a condition 

- It requires a condition, for e.g;

```
n=12
while(n>0):
    print(n)
    n}=n-
```

- At the start of each iteration the condition is checked.


## flow of execution for a while statement

- Evaluate the condition, yielding True or False.
- If the condition is false, exit the while statement and continue execution at the next statement
- if the condition is true, execute the body and then go to the condition again.
- The body of the loop will change the value of one or more variables so that condition eventually becomes false and the loop terminates.
break statement
- Sometimes we want to break out of a loop if some value is seen

```
n=12
while(n>0):
    print(n)
    n = n - 1
    if n == 7:
    break
12
1 1
10
9
8
```


## Strings

## String

" A sequence of characters.
course = "MSML 605"

- You can access the characters one at a time with the bracket operator:
second_character = course[1]

```
course = "MSML 605"
second_course = course[1]
print(second_course)
```

S
" index has to be an integer.

## strings

- len returns the number of characters in a string

```
course = "MSML 605"
second_course = course[1]
print(second_course)
```

S
len (course)


## strings

- Using negative indices


# course $=$ "MSML 605" <br> second_course $=$ course[1] <br> print(second_course) 

S
course[-1]
'5'

## Traversal

- Processing one character at a time:

```
course = 'MSML 605'
index = 0
while index < len(course):
    letter = course[index]
    print(letter)
    index += 1
```

M
S
M
L
6
0
5

* Displays each character on a separate line


## Traversal

- A more Pythonic way to traverse a string using for:

```
course = 'MSML 605'
for c in course:
    print(c)
M
S
M
L
6
0
5
course = 'MSML 605'
for c in course:
    print(c,end=' ')
M S M L 6 0 5
```


## String Operations

## String Concatenation

- Two strings can be concatenated using a '+' operator

```
word1 = 'abc'
word2 = 'def'
word = word1 + word2
print(word)
abcdef
```


## String Slices

- A segment of a string is a slice
- Selecting a slice is similar to selecting a character

```
s = "Monty Python"
print(s[0:5])
print(s[6:12])
```

Monty
Python

- The operator [n:m] returns the part of the string from the " $n$-eth" character to the "m-eth" character.
- It includes the first but excludes the last.


## String Slices

- If the first index before the colon is omitted, the slice starts at the beginning of the string.
- If you omit the second index, the slice goes to the end of the string

```
course = "MSML 605"
print(course[:3])
print(course[2:])
```

MSM
ML 605

- If the first index >= second index, the result is an empty string.


## Strings are immutable

- What happens if [ ] operators are used on the left side of the assignment operator?

```
greeting = 'hello world'
greeting[0] = 'J'
```

- You can create a new string new_greeting = 'J' + greeting[1:]

```
new_greeting = 'J' + greeting[1:]
new_greeting
'Jello world'
```

- It does not change the original string


## String Search

" What does the following function do?

```
def find(word,letter):
    index = 0
    while index < len(word):
        if word[index] == letter:
            return(index)
        index += 1
    return(-1)
```


## String Search

- What does the following function do?

```
def find(word,letter):
    index = 0
    while index < len(word):
        if word[index] == letter:
        return(index)
        index += 1
```

        return(-1)
    - find is the opposite of the [ ] operator.
- Instead of taking an index and extracting the corresponding character, it takes a character and finds an index


## Looping and Counting

- The following program counts the number of times the letter 'a' appears in a string:

```
word = 'banana'
count = 0
for letter in word:
    if letter == 'a':
    count += 1
print(count)
```

3

## String Methods

- A method is similar to a function - it takes arguments and returns a value.
- The syntax is different, for example

```
word = 'banana'
new_word = word.upper()
print(new_word)
```

BANANA

- A method call is called an invocation
- We are invoking upper on the word.


## String Methods

- There is a string method named 'find'
word = 'banana'
index = word.find('a') print(index)
- We invoke find on word.
- find can also find substrings not just characters word.find('na')


## String Methods

- It can take as a second argument the index where it should start:
word.find('na',3)
" As a third argument the index where it should stop:
name = 'bob'
name.find('b',1,2)


## in Operator

- The word 'in' is a boolean operator that takes two strings and returns True if the first appears as a substring in the second
'a' in 'banana'
'seed' in 'banana'


## String Comparison

- Relational operators work on strings
- Equality operator ‘==’
- Other relational operations are useful for putting words in alphabetical order:
if word < 'banana':
print('Your word, '+word+', comes before banana.') elif word > 'banana':
print('Your word,' + word + ', comes after banana.') else:
print('All right, bananas.')
- Uppercase letters come before all the lowercase letters.

Lists

## List

- A list is a sequence
- A sequence of values
- These values can be of any type.
- Values in a list are called items or elements.


## Lists

- The simplest way to create a list is to enclose elements in square brackets ( [ and ] )
[10, 12, 14, 15]
['Tom cat', 'Jerry mouse']
['spam', 21, 'a', 34.5]
- You can assign list values to variables data $=[10,12,14,15]$
- Even an empty list, arr = [ ]


## Lists are mutable

- The syntax for accessing elements is the same as for accessing string characters.
- The expression inside brackets specifies the index.
numbers $=[7,34,56]$ numbers[1] = 36 print(numbers)

Mapping

- You can think of a list as a relationship between indices and elements.
- This relationship is called mapping
" Each index "maps to" one of the elements.
num $=[2,34,56]$


## List Indices

- List indices work the same way as string indices:
- Any integer expression can be used as an index
- if you try to eat or write an element that does not exist, you get an IndexError
- If an index has a negative value, it counts backward from the end of the list.


## 'in' operator

The 'in' operator also works on lists.
cheeses = ['Cheddar’, 'Mozzarella’, ‘Blue’] 'Blue’ in cheeses
'Brie' in cheeses

Traversing a list
The most common way is with a 'for' loop

- Syntax is the same as for strings
cheeses = ['Cheddar', 'Mozzarella’, 'Blue’] for cheese in cheeses: print(cheese)
- This works well if you only need to read the elements.

Traversing a list

- If you want to write or update the elements, you need the indices.
- Common way is to combine functions 'range' and 'len'
for $i$ in range(len(numbers)): numbers[i] = numbers[i] * 2
- This loop traverses the list and updates each element.

Nested lists

- A list can contain another list
['spam', 1, ['Brie', 5, 3.2],2,[2,5,6]]
- Each internal list still counts as a single element.


## List Operations

- '+’ operator concatenates lists

$$
\begin{aligned}
& \ggg a=[1,2,3] \\
& \ggg b=[4,5,6] \\
& \text { >>> c }=a+b \\
& \operatorname{print}(c)
\end{aligned}
$$

[1, 2, 3, 4, 5, 6]

- '*' operator repeats a list given number of times

$$
\text { >>> [0] * } 4
$$

$[0,0,0,0]$
>>> $[1,2,3]$ * 3
$[1,2,3,1,2,3,1,2,3]$

## List Slices

- Slice operator also works on lists:
>>> $t=[' a$ ', ' $b$ ', ' $c$ ', ' $d$ ', 'e', 'f']
>>> t[1:3]
['b', 'c']
>>> t[:4]
['a', 'b', 'c', 'd']
>>> t[3:]
['d', 'e', 'f']
- If you omit the first index, the slice starts at the beginning
- If you omit the second, the slice goes to the end.
- If you omit both, the slice is a copy of the whole list
>>> t[:]
['a’, 'b', 'c', 'd', ‘e', ‘f']


## List Methods

- Python provides methods that operate on lists
- append adds a new element to the end of a list
>>> $t=[' a$ ', 'b', 'c']
>>> t.append('d')
>>> print( $t$ )
['a', 'b', 'c', 'd']


## List Methods

- extend takes a list as an argument and appends all of the elements:
$\ggg \mathrm{t} 1=\left[{ }^{6} a\right.$ ', ' $b$ ', ' $\left.c^{\prime}\right]$
$\ggg$ t2 $=\left[{ }^{6} d^{\prime},{ }^{\prime} e^{\prime}\right]$
>>> t1.extend(t2)
>>> print(t1)
['a', 'b', 'c', 'd', 'e']
- t2 is unmodified


## List Methods

- sort arranges the elements of the list from low to high:
$\ggg t=\left[{ }^{\prime} d^{\prime}, \quad ' b\right.$ ', 'c', 'a', 'e']
>>> t.sort()
>>> print( $t$ )
['a', 'b', 'c', 'd', 'e']
- List methods are all void; they modify the list and return None


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