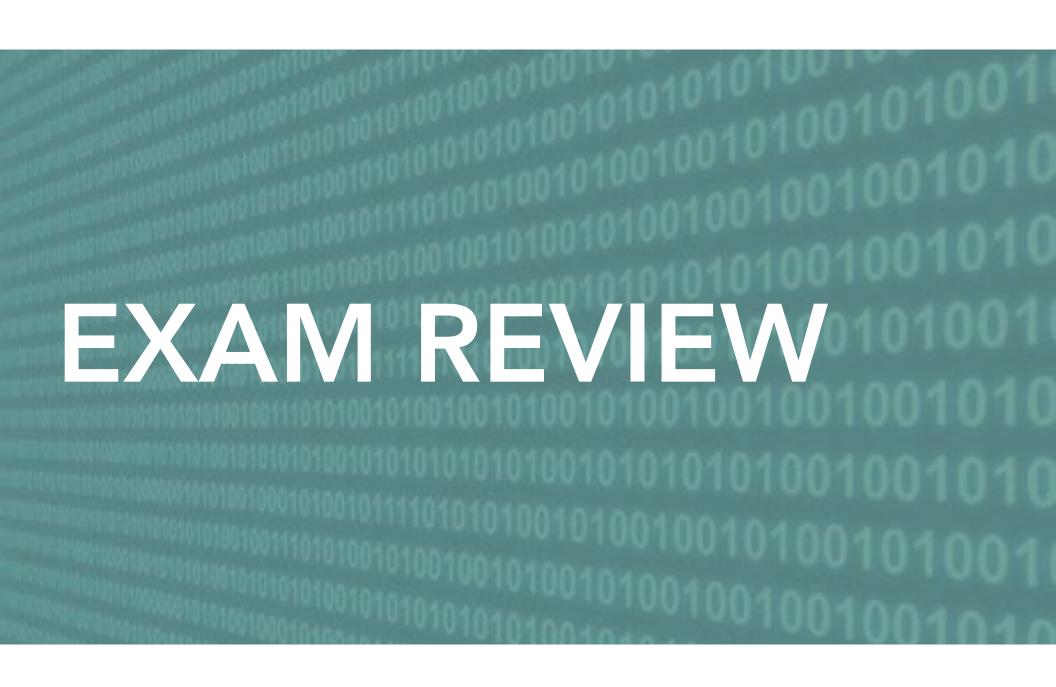
CONCEPTS OF PROGRAMMING

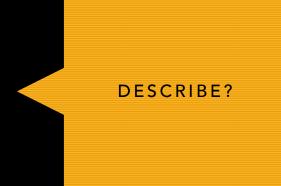
MPCS 50101 AUTUMN 2019 SESSION 12





```
Ta)
     True and True
Fb)
      False and True
Fc)
     1 == 1 and 2 == 1
      "chicago" == 'chicago'
T d)
     1 == 1 \text{ or } 2 != 1
Te)
T f)
     True and 1 == 1
Fg)
      False and 0 != 0
Th)
     True or 1 == 1
T i)
      "dogs" == "dog" + "s"
Fj)
      1 != 0 and 2 == 1
Tk)
      "dog" != "cat"
      1 = int("1")
T 1)
T m)
      not (True and False)
Fn)
      not (1 == 1 and 0 != 1)
Fo)
      not (10 == 1 or 1000 == 1000)
Fp)
      not (1 != 10 or 3 == 4)
      not ("cat" == "cat" and "cat" == "purr")
Tq)
Tr)
      1 == 1 and (not ("dog" == 1 or 1 == 0))
Fs)
      "exam" == "easy" and (not (3 == 4 or 3 == 3))
Ft)
      3 == 3 and (not ("coding" == "coding" or "Python" == "fun"))
Fu)
      isinstance(0,str)
      isinstance("int",str)
T v)
```

```
i = 1
while i < 5:
    j = 0
    while j < i:
        print(i % 2)
        j = j + 1
    i = i + 1
    print("")</pre>
```



```
4 ITERATIONS
i = 1
while i < 5:
                         NUMBERS IN
                           GROUP
     j
      = 0
     while j < i:
         print(i % 2)
     i = i + 1
     print("")
                          ALTERNATING 1
                              AND 0
             BLANK LINE
```

PROBLEM 3

```
greeting = "hello world"
print(greeting[:5])
```

> hello

PROBLEM 3

```
try:
    dog = int("dog")
except:
    print("A")
else:
    print("B")
```

> A

```
length = 3
width = 2.0
print(length / width)
> 1.5
```

```
numbers = [1,2,3,4,5]
print(sum(numbers))
> 15

print(min(numbers[1:]))
> 2
```

```
def my_function(n):
    if n < 0:
        print(':)')
    else:
        print("%s" % n)
        my_function(n-1)

my_function(5)</pre>
```

```
# Problem 4.
#
Write a currency conversion program that allows the users to input money in
# United States Dollars and have it converted to Japenes Yen.
#
# Prompt the user to enter a dollar amount in USD. Using the input, convert the
# money to Yen and display the result. The exchange rate is 1 Japanese Yen equals
# 0.0092 USD.
#
# Print out the both the USD and Yen values. Use the exact format presented below
# when printing the screen.
#
# United States Dollars: 92.44
# Japanese Yen: 1000.00
#
# Validate the user input to ensure that the calculations can be completed. If
# not, print a message to the user that indicates that there was a problem
# with the input and end the program.
```

```
def validate_input(usd):
    #
     return valid_usd
def convert(usd):
    return yen
def main():
    usd = input("Enter a dollar amount?")
    valid_usd = validate_input(usd)
   yen = convert(valid_usd)
   print("Japanese Yen: 92.00")
   __name__ == '__main__':
if
    main()
```

```
def validate_input(usd):
     #
                                                       FUNCTIONS
     return valid_usd
                                                      TAKE INPUT
                                                      AND RETURN
                                                         VALUE
def convert(usd):
    return yen
                                                         EACH MAIN
                                                         TASK HAS A
                                                          FUNCTION
def main():
    usd = input("Enter a dollar amount?")
    valid_usd = validate_input(usd)
   yen = convert(valid_usd)
                                                         ALL INPUT
   print("Japanese Yen: 92.00")
                                                        AND OUTPUT
                                                       FOR PROGRAM
                                                        IS DONE IN
                                                          MAIN()
if
     name
            == ' main
    main()
```

```
# Problem 6.
#
# One of the best ways to improve as a Scrabble player is to memorize all the 2
# and 3 letter words allowed during game play. It should be noted that many
# of the world's best Scrabble players believe it is a waste of time (and brain
 power) to learn the definitions.
#
 Given a list of all the 3 letter Scrabble words (3 letter words.txt) write a
 program to sort the list by the highest scoring words.
#
# The file is in the following format, where the 3 letter word is following by
 a pipe, "|", and then the definition:
#
#
        to exclaim in delight
  AAH
#
        East Indian shrub
  AAL
#
   AAS [aa] (rough, cindery lava)
#
# You should create a module named `words` that will handle all the functions
# related to reading, scoring and sorting the list.
```

```
def read file(file name):
    """Read in a file and return a list of all the words"""
    try:
        file handle = open(file name, 'r')
    except IOError:
        exit("File not found!")
    words = list()
    for line in file handle:
        # Word is only first 3 characteristic
        line = line[0:3]
        # Remove all blanks
        line = line.strip()
        line = line.lower()
        if line != "":
            words.append(line)
    return words
```

```
def score_word(word):
    tile_score = {"a": 1, "c": 3, "b": 3, "e": 1, "d": 2, "g": 2,"f": 4,
        "i": 1, "h": 4, "k": 5, "j": 8, "m": 3, "l": 1, "o": 1, "n": 1,
        "q": 10, "p": 3, "s": 1, "r": 1, "u": 1, "t": 1, "w": 4, "v": 4,
        "y": 4, "x": 8, "z": 10}
    score = 0
    for letter in word:
        score += tile_score[letter]
    return score
```

```
if __name__ == '__main__':

# Read in file
    three_letter_words = read_file('3letter_words.txt')

# Score words
    scored_words = dict()
    for word in three_letter_words:
        score = score_word(word)
        scored_words[word] = score
```

```
# Track score
   by_score = dict()
   biggest_score = -1
   for word in scored_words:
        score = scored_words[word]
        if biggest_score < score:
            biggest_score = score
        if by_score.has_key(score):
            by_score[score].append(word)
        else:
            by_score[score] = list()
        print "----- By Score ----"
        print by_score[biggest_score]</pre>
```

```
# Brute force
    top score words = list()
    biggest_score = max(scored_words.values())
    print "Big", biggest score
    word counter = 0
    while word counter < 20:
        for word in scored words:
            if scored_words[word] == biggest_score:
                top_score_words.append(word)
                print word,scored_words[word],word_counter
                word counter += 1
                if word counter == 20:
                    break
        biggest_score -= 1
```

```
# Print to file

fh = open("3letter_words_sorted.txt",'w')
for word in top_score_words:
    fh.write(word + "\n")
fh.close()
```

```
# Problem 7. Bonus Point
#
# What do you get if you divide the circumference
# of a pumpkin by its diameter?
#
```

PROBLEM 6

```
# Problem 7. Bonus Point
#
# What do you get if you divide the circumference
# of a pumpkin by its diameter?
#
```

Pumpkin Pi





- One way in which OOP promotes cod reuse is through "inheritance"
- Inheritance is process where a child derives the attributes and methods from a parent class

```
class Parent:
    # attributes
    # methods

class Child(Parent):
    # parents attributes
    # parents methods

# childs attribues
    # childs methods
```

 This can be useful to model real-world relationship and hierarchies Parent: Animals

Child: Dog, Cat, Rabbit

Parent: Person

Child: Student, Teacher

- Can also be overkill
- Think about the benefits/ disadvantage when designing your classes

Parent: Item

Child: Car, Bread, Skate

Bad design



```
class Car(object):
   """A car for sale by dealership.
    Attributes:
        wheels: An integer representing the number of wheels the car has.
        miles: The integral number of miles driven on the car.
        make: The make of the car as a string.
        model: The model of the car as a string.
        year: The integral year the car was built.
   .....
   def __init__(self, wheels, miles, make, model, year):
        """Return a new Car object."""
        self.wheels = wheels
        self.miles = miles
        self.make = make
        self.model = model
        self.year = year
   def __str__(self):
        return "%s %s %d" % (self.make, self.model, self.year)
class Truck(object):
   """A truck for sale by dealership.
   Attributes:
        wheels: An integer representing the number of wheels the truck has.
        miles: The integral number of miles driven on the truck.
        make: The make of the truck as a string.
        model: The model of the truck as a string.
        year: The integral year the truck was built.
```

- Working smarter, not harder
- A `Car` is a type of `Vehicle and inherits all its properties
- Add/change only properties that are different

```
class Vehicle(object):
    """A vehicle for sale by dealership.
        wheels: An integer representing the number of wheels the car has.
        miles: The integral number of miles driven on the car.
        make: The make of the car as a string.
        model: The model of the car as a string.
        year: The integral year the car was built.
    wheels = 0
    def __init__(self, miles, make, model, year):
        """Return a new Vehicle object."""
        self.miles = miles
        self.make = make
        self.model = model
        self.year = year
        return "%s %s %d" % (self.make, self.model, self.year)
class Car(Vehicle):
    """A Car class"""
    wheels = 4
class Truck(Vehicle):
    """A Truck class"""
    wheels = 4
class Motorcyle(Vehicle):
    """A Motorcyle class"""
    wheels = 2
        """Override the parent implementation of __str__"""
        return "Motorcyles Rule - %s %s %d" % (self.make, self.model, self.year)
t = Truck(0, 'Honda', 'Accord', 2014)
c = Car(2343, 'Toyota', 'Sienna', 2008)
m = Motorcyle(10, 'Indian', "Chieftain",2016)
print t
print c
print m
```

wheels = 2

```
class Vehicle(object):
    """Base class"""
                                    BASECLASS (SUPERCLASS)
   wheels = 0
class Car(Vehicle):
    """A Car class"""
   wheels = 4
class Truck(Vehicle):
    """A Truck class"""
                                  SUBCLASSES (DERIVED CLASS)
   wheels = 4
class Motorcyle(Vehicle):
    """A Motorcyle class"""
```

- Not uncommon to declare a base class that will never be used directly
 - Abstract class

```
class Vehicle(object):
    """Base class"""
   wheels = 0
class Car(Vehicle):
    """A Car class"""
   wheels = 4
class Truck(Vehicle):
    """A Truck class"""
   wheels = 4
class Motorcyle(Vehicle):
    """A Motorcyle class"""
   wheels = 2
```

NEVER JUST A
VEHICLE

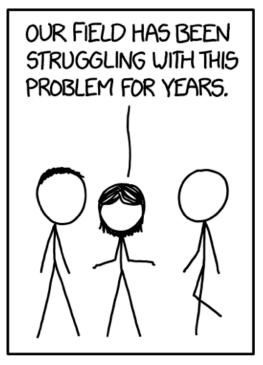
```
class Vehicle(object):
    """Base class"""
   wheels = 0
                                  SEE HOW CLASS
                                VARIABLES CAN BE
class Car(Vehicle):
                                     USEFUL
    """A Car class"""
   wheels = 4
class Truck(Vehicle):
    """A Truck class"""
   wheels = 4
                                               EVERY INSTANCE OF A
                                               CLASS OF TRUCK WILL
                                                  HAVE 4 WHEELS
class Motorcycle(Vehicle):
    """A Motorcycle class"""
   wheels = 2
```

- Multiple inheritance exists, but is difficult to get right
- Philosophical differences about the utility

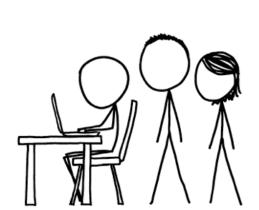
```
class Person:
    def __init__(self, name, age):
        self_name = name
        self_age = age
class SchoolMember(Person):
    pass
class Teacher(SchoolMember):
    pass
class Student(SchoolMember):
    pass
class StudentTeacher(Teacher, Student):
    pass
```

ALGORITHM ANALYSIS

ALGORITHM ANALYSIS





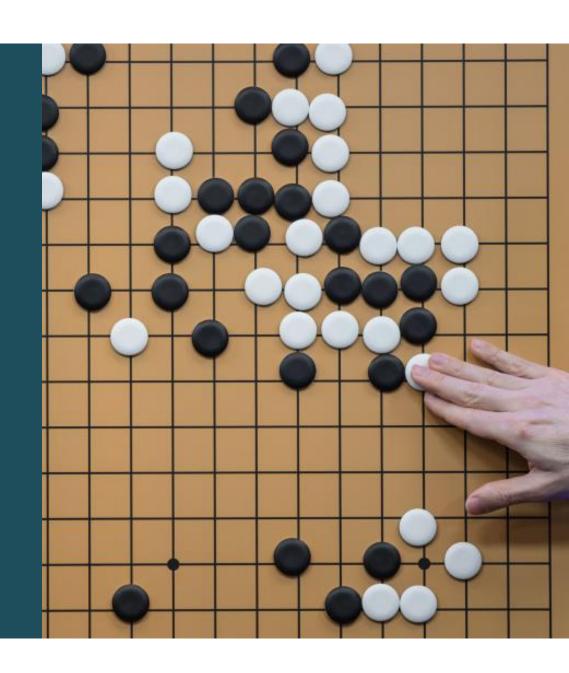




- Algorithm is step-by-step instructions for solving a problem
 - Making a PB&J sandwich
 - Driving directions
 - Sorting
 - Sum a list of numbers

```
# Algorithm to sum a range of
# numbers from 0 to n
def sum_list(n):
    sum = 0
    for i in range(1,n+1):
        sum = sum + i
    return sum
print(sum_list(10))
```

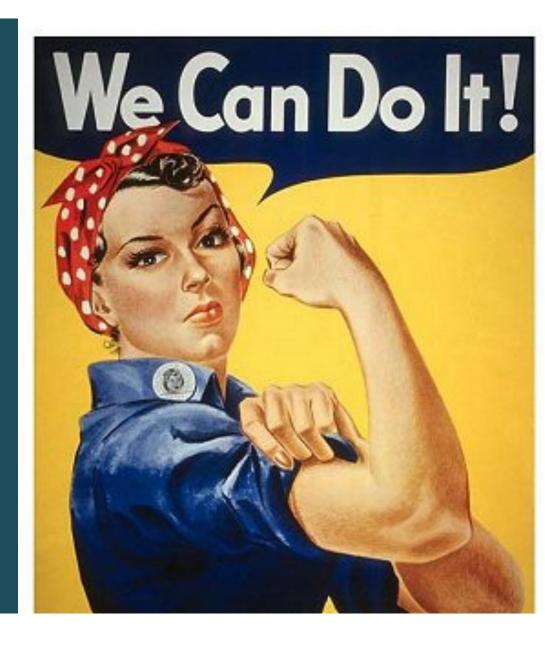
- An algorithm is NOT a program
- Program is an implementation of an algorithm in a language that can be interpreted and executed by a computer



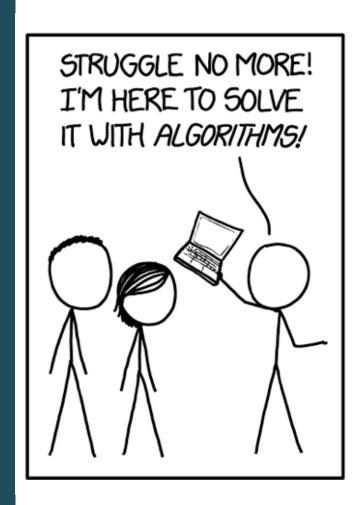
 A program may use <u>many</u> algorithms to solve a given problem

```
def process_file(file):?
  # Read a file
  # sort the file
  # identify duplicates
  # write to a file
```

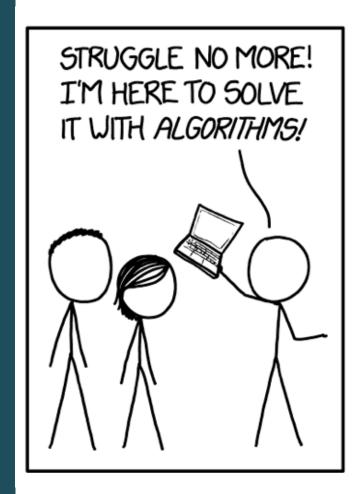
- A "robust" algorithm should
 - Solve the problem for all sets of inputs and outputs
 - Handle all error conditions
 - Be deterministic (same output for same set of inputs)



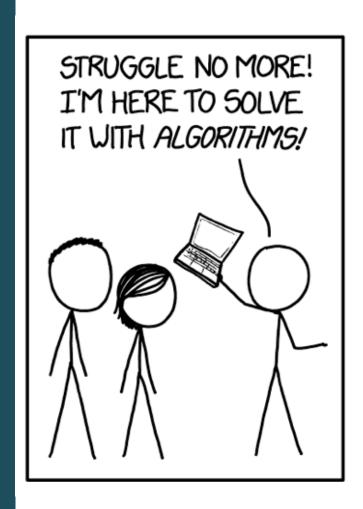
- Attributes and considerations for algorithms
 - Correctness It provides a correct solution to the problem



- Attributes and considerations for algorithms
 - Efficiency
 - Time: How long does it take to solve the problem?
 - Space: How much memory is needed?
 - Benchmarking vs. Analysis: Real world performance



- Attributes and considerations for algorithms
 - Ease of understanding
 - Program maintenance



- Attributes and considerations for algorithms
 - Elegance 😇



- For a given problem, there are many different algorithms to solve the same problem
- Which one is the "best"?
- How do we measure this?
 - Running time? Machine dependent!
 - Number of steps?

Contents [hide]

- 1 Classification
 - 1.1 Stability
- 2 Comparison of algorithms
- 3 Popular sorting algorithms
 - 3.1 Simple sorts
 - 3.1.1 Insertion sort
 - 3.1.2 Selection sort
 - 3.2 Efficient sorts
 - 3.2.1 Merge sort
 - 3.2.2 Heapsort
 - 3.2.3 Quicksort
 - 3.3 Bubble sort and variants
 - 3.3.1 Bubble sort
 - 3.3.2 Shellsort
 - 3.3.3 Comb sort
 - 3.4 Distribution sort
 - 3.4.1 Counting sort
 - 3.4.2 Bucket sort
 - 3.4.3 Radix sort
- 4 Memory usage patterns and index sorting
- 5 Related algorithms
- 6 History
- 7 See also
- 8 References
- 9 Further reading
- 10 External links

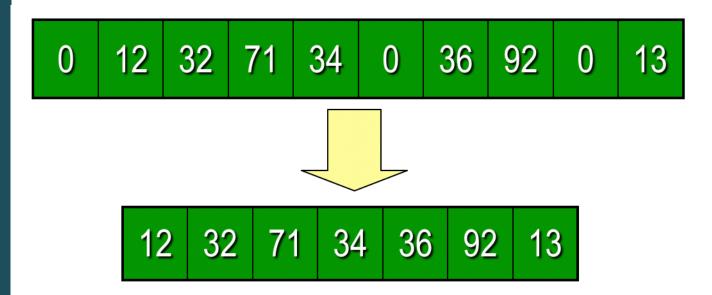
- Algorithm analysis is concerned with comparing algorithms based upon the amount of computing resources that each algorithm uses
 - Time, money, humans, ...
- Provide a way to compare algorithms to make educated decisions

Contents [hide]

- 1 Classification
 - 1.1 Stability
- 2 Comparison of algorithms
- 3 Popular sorting algorithms
 - 3.1 Simple sorts
 - 3.1.1 Insertion sort
 - 3.1.2 Selection sort
 - 3.2 Efficient sorts
 - 3.2.1 Merge sort
 - 3.2.2 Heapsort
 - 3.2.3 Quicksort
 - 3.3 Bubble sort and variants
 - 3.3.1 Bubble sort
 - 3.3.2 Shellsort
 - 3.3.3 Comb sort
 - 3.4 Distribution sort
 - 3.4.1 Counting sort
 - 3.4.2 Bucket sort
 - 3.4.3 Radix sort
- 4 Memory usage patterns and index sorting
- 5 Related algorithms
- 6 History
- 7 See also
- 8 References
- 9 Further reading
- 10 External links

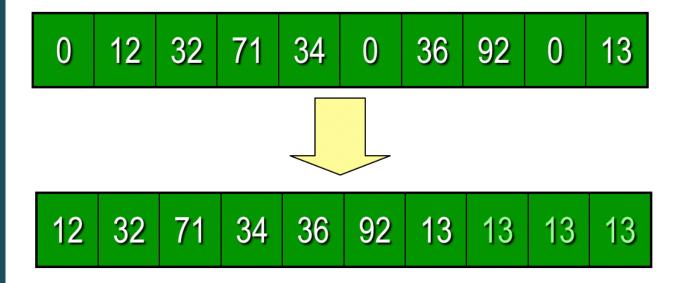
EXAMPLE: THE DATA CLEANUP PROBLEM

Remove "0" from a list of numbers



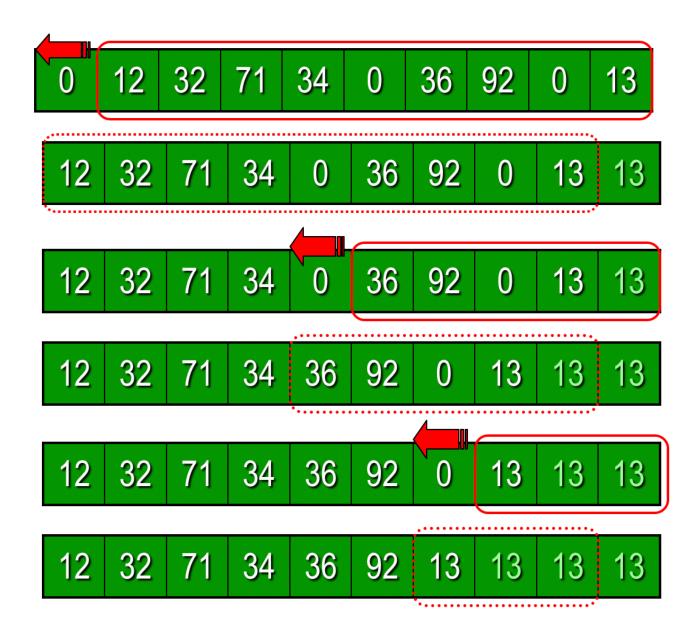
SHUFFLE LEFT ALGORITHM

- Scan the list from left to right
- Whenever we encounter a 0 element we copy ("shuffle") the rest of the list one position left



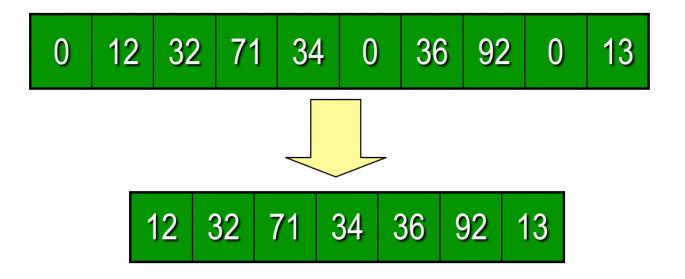
SHUFFLE LEFT ALGORITHM

- Scan the list from left to right
- Whenever we encounter a 0 element we copy ("shuffle") the rest of the list one position left



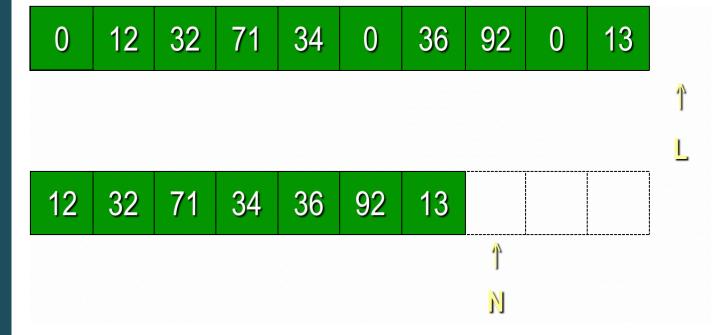
COPY-OVER ALGORITHM

- Scan the list from left to right
- Whenever we encounter a nonzero element we copy it over to a new list



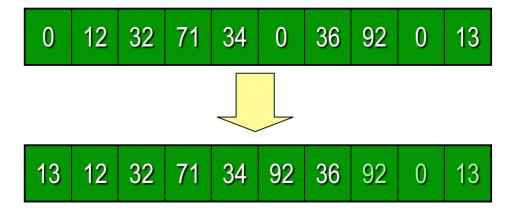
COPY-OVER ALGORITHM

- Scan the list from left to right
- Whenever we encounter a nonzero element we copy it over to a new list

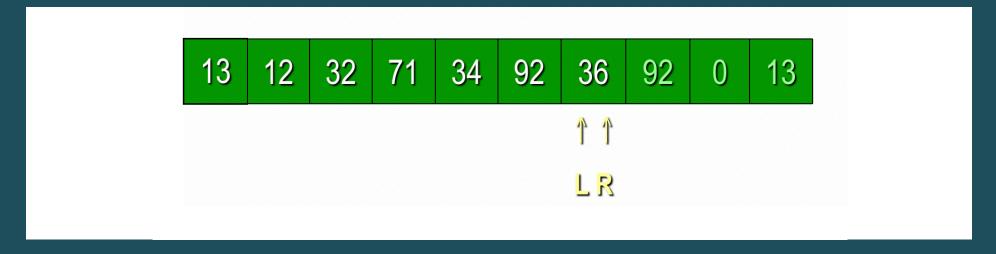


CONVERGING-POINTERS ALGORITHM

- Scan the list from both left (L) and right (R)
- Whenever L encounters a 0
 element, the element at
 location R is copied to location
 L, then R reduced



CONVERGING-POINTERS ALGORITHM



- Scan the list from both left (L) and right (R)
- Whenever L encounters a 0 element, the element at location R is copied to location L, then R reduced

- Which one is the most space efficient?
- Which one is the most time efficient?









for i in 0100:	Space	Time
Shuffle Left	Constant	Go Through List Many Times
Copy Over	Double	Go Through List Once
Converging Pointers	Constant	Go Through List Once

- Metric to measure time efficiency of algorithms
 - How long does it take to solve the problem?
 - Depends on machine speed
 - How many steps does the algorithm execute?
 - Need to count all steps



- How many "fundamental steps" does the algorithm execute?
- Depends on size and type of input, interested in knowing
 - Best-case, Worst-case, Average-case behavior



SEQUENTIAL SEARCH ALGORITHM

Find a name in array of strings

```
    Get values for Name, N<sub>1</sub>,..., N<sub>n</sub>
    Set the value i to 1 and set the value of Found to NO
    Repeat steps 4 through 7 until Found = YES or i > n
    If Name = N<sub>i</sub> then
    Print the value of N
    Set the value of Found to YES
    Else
    Add 1 to the value of i
    If Found = NO then print "Sorry, name not in directory"
    Stop
```

SEQUENTIAL SEARCH ALGORITHM

Find a name in array of strings

```
def sequential_search(name, names):
    found = False
    i = 0
    n = len(name)
    while found is False or i > n:
        if name == names[i]:
            found = True
                print "Found"
        i = i + 1
    if found == False:
        print "Sorry, the name is not there"

names = ["pebbles", "lola", "chloe"]
sequential_search("lola", names)
```

SEQUENTIAL SEARCH ALGORITHM

- How many steps does the algorithm execute?
 - Steps 2, 5, 6, 8 and 9 are executed at most once.
 - Steps 3, 4, and 7 depends on input size.
- Worst case:
 - Step 3, 4, and 7 are executed at most n-times.
- Best case:
 - Step 3 and 4 are executed only once.
- Average case:
 - Step 3, 4 are executed approximately (n/2)-times.

```
    Get values for Name, N<sub>1</sub>,..., N<sub>n</sub>, T<sub>1</sub>,..., T<sub>n</sub>
    Set the value i to land set the value of Found to NO
    Repeat steps 4 through 7 until Found = YES or i > n
    If Name = N<sub>i</sub> then
    Print the value of T<sub>i</sub>
    Set the value of Found to YES
    Else
    Add 1 to the value of i
    If Found = NO then print "Sorry, name not in directory"
    Stop
```

SEQUENTIAL SEARCH ALGORITHM

- How many steps does the algorithm execute?
 - Steps 2, 5, 6, 8 and 9 are executed at most once.
 - Steps 3, 4, and 7 depends on input size.
- Worst case:
 - Step 3, 4, and 7 are executed at most n-times.
- Best case:
 - Step 3 and 4 are executed only once.
- Average case:
 - Step 3, 4 are executed approximately (n/2)-times.

1. Get values for Name, $N_1, ..., N_n$, $T_1, ..., T_n$ 2. Set the value i to land set the value of Found to NO
3. Repeat steps 4 through 7 until Found = YES or i > n4. If Name = N_i then
5. Print the value of T_i 6. Set the value of Found to YES
Else
7. Add 1 to the value of i8. If Found = NO then print "Sorry, name not in directory"
9. Stop

SEQUENTIAL SEARCH ALGORITHM

- How many steps does the algorithm execute?
 - Steps 2, 5, 6, 8 and 9 are executed at most once.
 - Steps 3, 4, and 7 depends on input size.
- Worst case:
 - Step 3, 4, and 7 are executed at most n-times
- Best case:
 - Step 3 and 4 are executed only once
- Average case:
 - Step 3, 4 are executed approximately (n/2)-times

```
    Get values for Name, N<sub>1</sub>,..., N<sub>n</sub>, T<sub>1</sub>,..., T<sub>n</sub>
    Set the value i to land set the value of Found to NO
    Repeat steps 4 through 7 until Found = YES or i > n
    If Name = N<sub>i</sub> then
    Print the value of T<sub>i</sub>
    Set the value of Found to YES
    Else
    Add 1 to the value of i
    If Found = NO then print "Sorry, name not in directory"
    Stop
```

THE NAME IS LAST

SEQUENTIAL SEARCH ALGORITHM

- How many steps does the algorithm execute?
 - Steps 2, 5, 6, 8 and 9 are executed at most once.
 - Steps 3, 4, and 7 depends on input size.
- Worst case:
 - Step 3, 4, and 7 are executed at most n-times
- Best case:
 - Step 3 and 4 are executed only once
- Average case:
 - Step 3, 4 are executed approximately (n/2)-times

```
    Get values for Name, N<sub>1</sub>,..., N<sub>n</sub>, T<sub>1</sub>,..., T<sub>n</sub>
    Set the value i to land set the value of Found to NO
    Repeat steps 4 through 7 until Found = YES or i > n
    If Name = N<sub>i</sub> then
    Print the value of T<sub>i</sub>
    Set the value of Found to YES
    Else
    Add 1 to the value of i
    If Found = NO then print "Sorry, name not in directory"
    Stop
```

THE NAME IS FIRST

SEQUENTIAL SEARCH ALGORITHM

- How many steps does the algorithm execute?
 - Steps 2, 5, 6, 8 and 9 are executed at most once.
 - Steps 3, 4, and 7 depends on input size.
- Worst case:
 - Step 3, 4, and 7 are executed at most n-times
- Best case:
 - Step 3 and 4 are executed only once
- Average case:
 - Step 3, 4 are executed approximately (n/2)-times

Get values for Name, N₁,..., N_n, T₁,..., T_n
 Set the value i to land set the value of Found to NO
 Repeat steps 4 through 7 until Found = YES or i > n
 If Name = N_i then
 Print the value of T_i
 Set the value of Found to YES
 Else
 Add 1 to the value of i
 If Found = NO then print "Sorry, name not in directory"
 Stop

THE NAME IS RANDOM

SEQUENTIAL SEARCH ALGORITHM

```
def sequential_search(name, names):
    found = False
    i = 0
    n = len(name)
    while found is False or i > n:
        if name == names[i]:
            found = True
                print "Found"
        i = i + 1
    if found == False:
        print "Sorry, the name is not there"
```

```
names = ["pebbles", "lola", "chloe"]
sequential_search("lola", names)
```

WHAT IF THIS WAS REALLY LONG LIST?

- Not interested in knowing the exact number of steps the algorithm performs
- Mainly interested in knowing how the number of steps grows with increased input size
- Why?
 - Given large enough input (∞), the algorithm with faster growth will execute more steps

- Algorithm: Sum of a range of integers
- The time grows proportional to the number of inputs

```
def sumOfN2(n):
    start = time.time()
    theSum = 0
    for i in range(1, n+1):
        theSum = theSum + i
    end = time.time()
    return theSum, end-start
for i in range(0, 1000000, 100000):
    sum, duration = sumOfN2(i)
    print("%d: Sum is %d required
%10.7f seconds" % (i, sum, duration))
```



```
def sumOfN2(n):
    """Sum through iteration."""
    start = time.time()  # 1 time
    theSum = 0  # 1 time
    for i in range(1, n+1):  # n times
        theSum = theSum + i  # 1 times
    end = time.time()  # 1 time
    return theSum, end-start  # 1 time
```



```
0: Sum is 0 required 0.0000031 seconds
def sumOfN2(n):
                                                     100000: Sum is 5000050000 required 0.0190489 seconds
                                                     200000: Sum is 20000100000 required 0.0326600 seconds
      start = time.time()
                                                     300000: Sum is 45000150000 required 0.0464170 seconds
      theSum = 0
                                                     400000: Sum is 80000200000 required 0.0582540 seconds
                                                     500000: Sum is 125000250000 required 0.0717301 seconds
      for i in range(1, n+1):
                                                     600000: Sum is 180000300000 required 0.0905130 seconds
             theSum = theSum + i
                                                     700000: Sum is 245000350000 required 0.1016700 seconds
                                                     800000: Sum is 320000400000 required 0.1161430 seconds
      end = time.time()
                                                     900000: Sum is 405000450000 required 0.1323390 seconds
      return theSum, end-start
```

```
for i in range(0, 1000000, 1000000):
    sum, duration = sumOfN2(i)
    print("%d: Sum is %d required %10.7f seconds" % \
        (i, sum, duration))
```



- Algorithm: Sum of a range of integers
- The time is constant for any number of inputs

```
def sumOfN3(n):
    """With closed equation."""
    start = time.time()
                                # 1 time
   theSum = n * (n + 1) / 2
                             # 1 time
    end = time.time()
                                # 1 time
    return theSum, end-start
                                # 1 time
print("Sum is %d required %10.7f seconds" % sum0fN3(100))
print("Sum is %d required %10.7f seconds" % sumOfN3(10000))
print("Sum is %d required %10.7f seconds" %
sumOfN3(10000000))
# Sum is 5050 required 0.0000021 seconds
# Sum is 50005000 required 0.0000010 seconds
# Sum is 5000000005000000000 required 0.0000000 seconds
```



- To compare algorithms we are concerned with their relative rate of growth
- Order of magnitude, O(f(n)) measures how the number of steps grows with input size n
 - For dominant part of the algorithm
- Referred to as "Big-O" notation

Not interested in the exact number of steps, for example, algorithm where total steps,
 T(n)



- T(5n)

- T(5n + 345)

- T(4500n+1000)

T(N) HAS AN ORDER OF MAGNITUDE F(N)

OR

O(N)

• For all the above algorithms, the total number of steps grows approx. proportionally with input size (given large enough n)

MPCS 50101 AUTUMN 2019 SESSION 12

