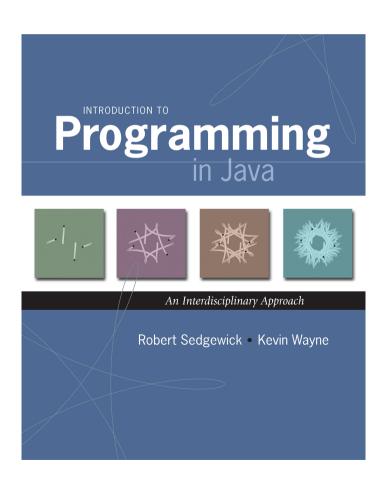
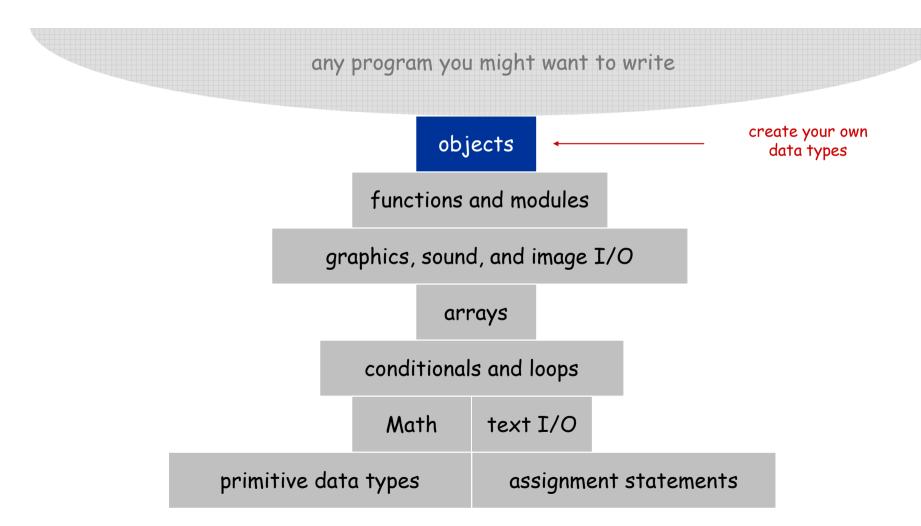
Classes and Objects



A Foundation for Programming



Data Types

Data type. Set of values and operations on those values.

Primitive types. Values directly map to machine representation; ops directly map to machine instructions.

Data Type	Set of Values	Operations
boolean	true, false	not, and, or, xor
int	-2^{31} to $2^{31} - 1$	add, subtract, multiply
double	any of 264 possible reals	add, subtract, multiply

We want to write programs that process other types of data.

- Colors, pictures, strings, input streams, ...
- Complex numbers, vectors, matrices, polynomials, ...
- Points, polygons, charged particles, celestial bodies, ...

Objects

Object. Holds a data type value; variable name refers to object.

Object-oriented programming.

- Create your own data types (set of values and ops on them).
- Use them in your programs (manipulate objects that hold values).

Data Type	Set of Values	Operations
Color	24 bits	get red component, brighten
Picture	2D array of colors	get/set color of pixel (i, j)
String	sequence of characters	length, substring, compare

This lecture. Use existing data types.

Next lecture. Create your own data types.

Constructors and Methods

To construct a new object:

- Use keyword new (to invoke constructor).
- Use name of data type (to specify which type of object).

To apply an operation:

- Use name of object (to specify which object).
- Use the dot operator (to invoke method).
- Use the name of the method (to specify which operation).

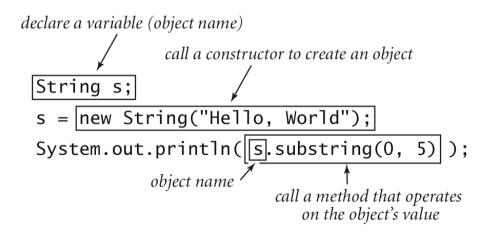


Image Processing

Color Data Type

Color. A sensation in the eye from electromagnetic radiation.

Set of values. [RGB representation] 256³ possible values, which quantify the amount of red, green, and blue, each on a scale of 0 to 255.

R	G	В	Color
255	0	0	
0	255	0	
0	0	255	
255	255	255	
0	0	0	
255	0	255	
105	105	105	

Color Data Type

Color. A sensation in the eye from electromagnetic radiation.

Set of values. [RGB representation] 256³ possible values, which quantify the amount of red, green, and blue, each on a scale of 0 to 255.

API. Application Programming Interface.

```
public class java.awt.Color
```

```
Color(int r, int g, int b)

int getRed() red intensity

int getGreen() green intensity

int getBlue() blue intensity

Color brighter() brighter version of this color

Color darker() darker version of this color

String toString() string representation of this color

boolean equals(Color c) is this color's value the same as c's?
```

http://download.oracle.com/javase/6/docs/api/java/awt/Color.html

Albers Squares

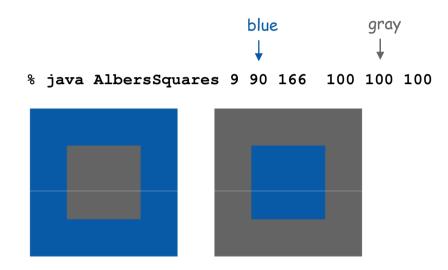
Josef Albers. Revolutionized the way people think about color.



Homage to the Square by Josef Albers (1949-1975)

Albers Squares

Josef Albers. Revolutionized the way people think about color.



Using Colors in Java

```
import java.awt.Color;
                                           to access Color library
public class AlbersSquares {
   public static void main(String[] args) {
      int r1 = Integer.parseInt(args[0]);
      int g1 = Integer.parseInt(args[1]);
                                                     first color
      int b1 = Integer.parseInt(args[2]);
      Color c1 = new Color(r1, q1, b1);
      int r2 = Integer.parseInt(args[3]);
      int q2 = Integer.parseInt(args[4]);
                                                   second color
      int b2 = Integer.parseInt(args[5]);
      Color c2 = new Color(r2, q2, b2);
      StdDraw.setPenColor(c1);
                                                   first square
      StdDraw.filledSquare(.25, .5, .2);
      StdDraw.setPenColor(c2);
      StdDraw.filledSquare(.25, .5, .1);
      StdDraw.setPenColor(c2);
      StdDraw.filledSquare(.75, .5, .2);
                                                  second square
      StdDraw.setPenColor(c1);
      StdDraw.filledSquare(.75, .5, .1);
```

Monochrome Luminance

Monochrome luminance. Effective brightness of a color.

NTSC formula. Y = 0.299r + 0.587g + 0.114b.

```
import java.awt.Color;

public class Luminance {
    public static double lum(Color c) {
        int r = c.getRed();
        int g = c.getGreen();
        int b = c.getBlue();
        return .299*r + .587*g + .114*b;
    }
}
```

Color Compatibility

- Q. Which font colors will be most readable with which background colors on computer and cell phone screens?
- A. Rule of thumb: difference in luminance should be ≥ 128 .



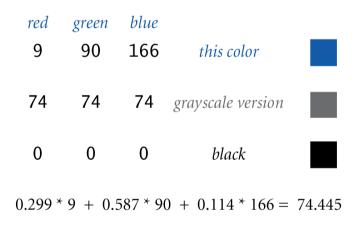
```
public static boolean compatible(Color a, Color b) {
   return Math.abs(lum(a) - lum(b)) >= 128.0;
}
```

Grayscale

Grayscale. When all three R, G, and B values are the same, resulting color is on grayscale from 0 (black) to 255 (white).

Convert to grayscale. Use luminance to determine value.

```
public static Color toGray(Color c) {
   int y = (int) Math.round(lum(c));
   Color gray = new Color(y, y, y);
   return gray;
}
```

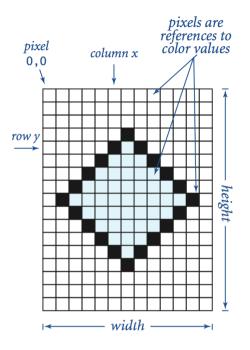


Bottom line. We are writing programs that manipulate color.

Picture Data Type

Raster graphics. Basis for image processing.

Set of values. 2D array of color objects (pixels).



API.

public class Picture

```
Picture(String filename)
                                                   create a picture from a file
        Picture(int w, int h)
                                                   create a blank w-by-h picture
  int width()
                                                  return the width of the picture
  int height()
                                                   return the height of the picture
Color get(int x, int y)
                                                  return the color of pixel (x, y)
 void set(int x, int y, Color c)
                                                  set the color of pixel (x, y) to C
 void show()
                                                   display the image in a window
 void save(String filename)
                                                   save the image to a file
```

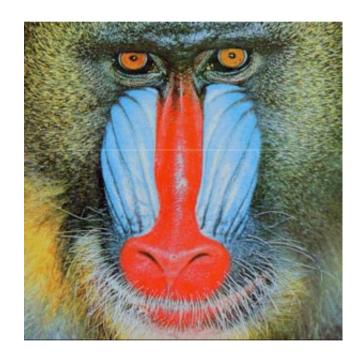
Image Processing: Grayscale Filter

Goal. Convert color image to grayscale according to luminance formula.

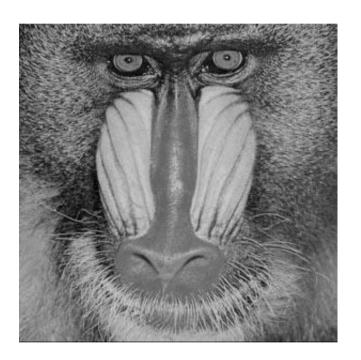
```
import java.awt.Color;
public class Grayscale {
   public static void main(String[] args) {
      Picture pic = new Picture(args[0]);
      for (int x = 0; x < pic.width(); x++) {
         for (int y = 0; y < pic.height(); y++) {
            Color color = pic.get(x, y);
            Color gray = Luminance.toGray(color); __
            pic.set(x, y, gray);
      pic.show();
```

Image Processing: Grayscale Filter

Goal. Convert color image to grayscale according to luminance formula.



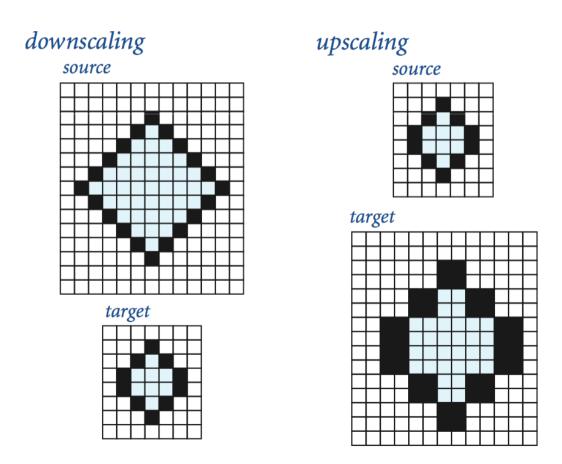
mandrill.jpg



% java Grayscale mandrill.jpg

Goal. Shrink or enlarge an image to desired size.

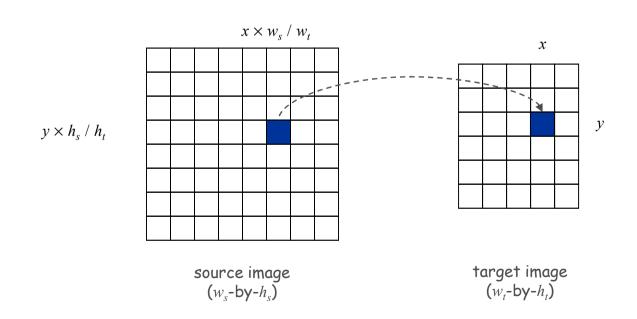
Downscaling. To shrink, delete half the rows and columns. Upscaling. To enlarge, replace each pixel by 4 copies.



Goal. Shrink or enlarge an image to desired size.

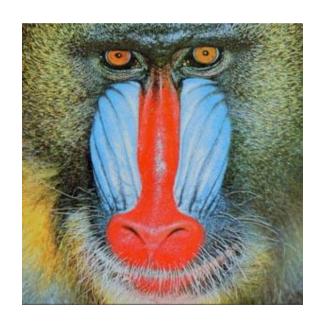
Uniform strategy. To convert from w_s -by- h_s to w_t -by- h_t :

- Scale column index by w_s / w_t .
- Scale row index by h_s / h_t .
- Set color of pixel (x, y) in target image to color of pixel $(x \times w_s / w_t, y \times h_s / h_t)$ in source image.



```
import java.awt.Color;
public class Scale {
   public static void main(String[] args) {
      String filename = args[0];
      int w = Integer.parseInt(args[1]);
      int h = Integer.parseInt(args[2]);
      Picture source = new Picture (filename);
      Picture target = new Picture(w, h);
      for (int tx = 0; tx < target.width(); tx++) {</pre>
         for (int ty = 0; ty < target.height(); ty++) {</pre>
            int sx = tx * source.width() / target.width();
            int sy = ty * source.height() / target.height();
            Color color = source.get(sx, sy);
            target.set(tx, ty, color);
     source.show();
     target.show();
```

Scaling filter. Creates two Picture objects and two windows.

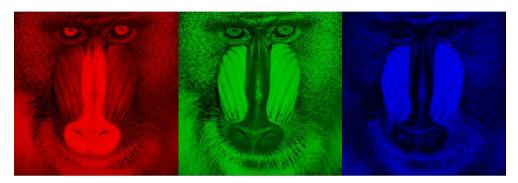


mandrill.jpg
(298-by-298)



% java Scale mandrill.jpg 400 200

More Image Processing Effects



RGB color separation



Text Processing

String Data Type

String data type. Basis for text processing.

Set of values. Sequence of Unicode characters.

API. public class String (Java string data type)

```
String(String s)
                                                   create a string with the same value as S
      int length()
                                                   string length
    char charAt(int i)
                                                   ith character
  String substring(int i, int j)
                                                   ith through (i-1)st characters
 boolean contains(String sub)
                                                   does string contain sub as a substring?
 boolean startsWith(String pre)
                                                   does string start with pre?
 boolean endsWith(String post)
                                                   does string end with post?
      int indexOf(String p)
                                                   index of first occurrence of p
      int indexOf(String p, int i)
                                                   index of first occurrence of p after i
  String concat(String t)
                                                   this string with t appended
      int compareTo(String t)
                                                   string comparison
  String replaceAll(String a, String b)
                                                   result of changing as to bs
String[] split(String delim)
                                                   strings between occurrences of delim
 boolean equals(String t)
                                                   is this string's value the same as t's?
```

Typical String Processing Code

```
public static boolean isPalindrome(String s)
                        int N = s.length();
    is the string
                        for (int i = 0; i < N/2; i++)
                            if (s.charAt(i) != s.charAt(N-1-i))
   a palindrome?
                               return false;
                         return true;
                     }
  extract file name
                     String s = args[0];
and extension from a
                     int dot = s.index0f(".");
                     String base
                                        = s.substring(0, dot);
   command-line
                     String extension = s.substring(dot + 1, s.length());
     argument
                     String query = args[0];
  print all lines in
                     while (!StdIn.isEmpty())
 standard input that
   contain a string
                         String s = StdIn.readLine();
   specified on the
                         if (s.contains(query)) StdOut.println(s);
   command line
                     while (!StdIn.isEmpty())
print all the hyperlinks
(to educational institu-
                         String s = StdIn.readString();
                         if (s.startsWith("http://") && s.endsWith(".edu"))
tions) in the text file on
                            StdOut.println(s);
   standard input
                     }
```

Gene Finding

Pre-genomics era. Sequence a human genome.

Post-genomics era. Analyze the data and understand structure.

Genomics. Represent genome as a string over { A, C, T, G } alphabet.

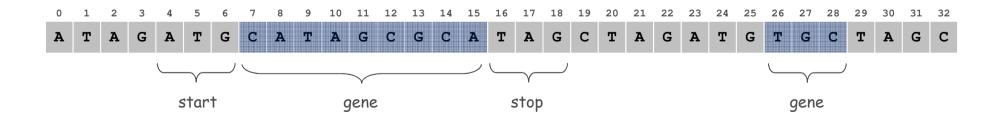
Gene. A substring of genome that represents a functional unit.

Preceded by ATG. [start codon]

Multiple of 3 nucleotides. [codons other than start/stop]

Succeeded by TAG, TAA, or TGA. [stop codons]

Goal. Find all genes.



Gene Finding: Algorithm

Algorithm. Scan left-to-right through genome.

- If start codon, then set beg to index i.
- If stop codon and substring is a multiple of 3
 - output gene
 - reset beg to -1

i .	i codon		beg	gene	remaining portion of input string					
	start	stop	beg	gene	remaining portion of input string					
0			-1		ATAGATGCATAGCGCATAGCTAGATGTGCTAGC					
1		TAG	-1		ATAGATGCATAGCGCATAGCTAGATGTGCTAGC					
4	ATG		4	multiple of 2	ATAGATGCATAGCGCATAGCTAGATGTGCTAGC					
9		TAG	4	multiple of 3	ATAGATGCATAGCGCATAGCTAGATGTGCTAGC					
16		TAG	4	CATAGCGCA	ATAGATGCATAGCGCATAGCTAGATGTGCTAGC					
20		TAG	-1		ATAGATGCATAGCGCATAGCTAGATGTGCTAGC					
23	ATG		23		ATAGATGCATAGCGCATAGCTAGATGTGCTAGC					
29		TAG	23	TGC	ATAGATGCATAGCGCATAGCTAGATGTGCTAGC					

Gene Finding: Implementation

```
public class GeneFind {
   public static void main(String[] args) {
      String start = args[0];
      String stop = args[1];
      String genome = StdIn.readAll();
      int beg = -1;
      for (int i = 0; i < genome.length() - 2; <math>i++) {
         String codon = genome.substring(i, i+3);
         if (codon.equals(start)) beg = i;
         if (codon.equals(stop) && beg !=-1 && beg+3 < i) {
            String gene = genome.substring(beg+3, i);
            if (gene.length() % 3 == 0) {
                StdOut.println(gene);
               beg = -1;
                         % more genomeTiny.txt
                         ATAGATGCATAGCGCATAGCTAGATGTGCTAGC
                         % java GeneFind ATG TAG < genomeTiny.txt
                         CATAGCGCA
                          TGC
```

OOP Context for Strings

Possible memory representation of a string.

genome = "aacaagtttacaagc";

D0	D1	D2	D3	D4	D5	D6	D7	D8	D9	DA	DB	DC	DD	DE
a	a	С	a	a	g	t	t	t	a	С	a	a	g	С

A0 A1

D0 15

mory length

address

genome

s = genome.substring(1, 5);

t = genome.substring(9, 13);

B0 B1 B2 B3 D1 4 D9 4

S

s and t refer to different strings that have the same value "acaa"

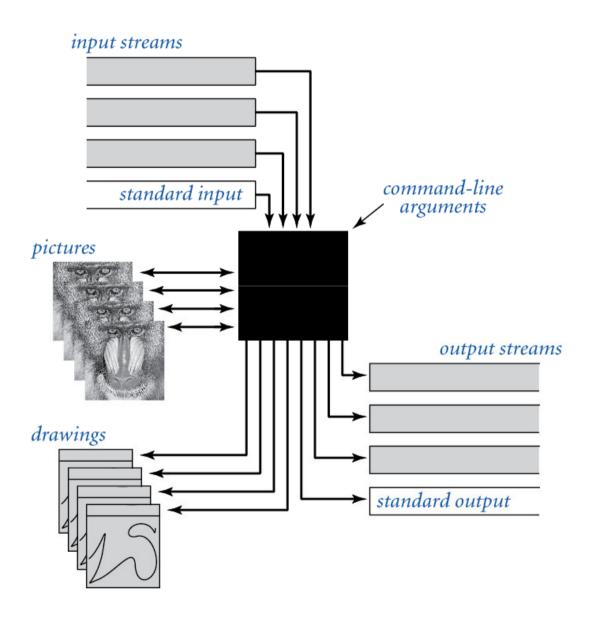
. (s == t) is false, but (s.equals(t)) is true.

compares pointers

compares character sequences

In and Out

Bird's Eye View (Revisited)



Non-Standard Input

or use OS to redirect from one file

Standard input. Read from terminal window.

Goal. Read from several different input streams.

In data type. Read text from stdin, a file, a web site, or network.

Ex: Are two text files identical?

Screen Scraping

Goal. Find current stock price of Google.

```
Last Trade:
<biq>
<b>576.50</b>
</big>
Trade Time:
11:45AM ET
```

http://finance.yahoo.com/q?s=goog

Screen Scraping

Goal. Find current stock price of Google.

- s.indexOf(t, i): index of first occurrence of pattern t
 in String s, starting at offset i.
- Read raw html from http://finance.yahoo.com/q?s=goog.
- Find first string delimited by and after Last Trade.

```
public class StockQuote {
   public static void main(String[] args) {
      String name = "http://finance.yahoo.com/q?s=";
      In in = new In(name + args[0]);
      String input = in.readAll();
      int start = input.indexOf("Last Trade:", 0);
      int from = input.indexOf("<b>", start);
      int to = input.indexOf("</b>", from);
      String price = input.substring(from + 3, to);
      StdOut.println(price);
   }
}

   * java StockQuote goog
   576.50
```

OOP Summary

Object. Holds a data type value; variable name refers to object.

In Java, programs manipulate references to objects.

- Exception: primitive types, e.g., boolean, int, double.
- Reference types: String, Picture, Color, arrays, everything else.
- OOP purist: language should not have separate primitive types.

Bottom line. We wrote programs that manipulate colors, pictures, and strings.

Next time. We'll write programs that manipulate our own abstractions.

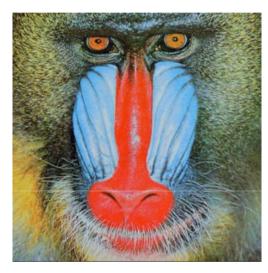
Extra Slides

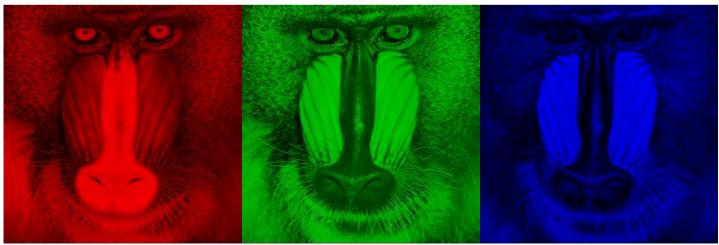
Color Separation

```
import java.awt.Color;
public class ColorSeparation {
    public static void main(String args[]) {
        Picture pic = new Picture(args[0]);
        int width = pic.width();
        int height = pic.height();
        Picture R = new Picture(width, height);
        Picture G = new Picture(width, height);
        Picture B = new Picture(width, height);
        for (int x = 0; x < width; x++) {
            for (int y = 0; y < height; y++) {
                Color c = pic.qet(x, y);
                int r = c.getRed();
                int g = c.getGreen();
                int b = c.getBlue();
                R.set(x, y, new Color(r, 0, 0));
                G.set(x, y, new Color(0, g, 0));
                B.set(x, y, new Color(0, 0, b));
        R.show();
        G. show();
        B. show();
```

Color Separation

ColorSeparation.java. Creates three Picture objects and windows.





Memory Management

Value types.

- Allocate memory when variable is declared.
- Can reclaim memory when variable goes out of scope.

Reference types.

- Allocate memory when object is created with new.
- Can reclaim memory when last reference goes out of scope.
- Significantly more challenging if several references to same object.

Garbage collector. System automatically reclaims memory; programmer relieved of tedious and error-prone activity.

Defining Data Types in Java

To define a data type, specify:

- Set of values.
- Operations defined on those values.

Java class. Defines a data type by specifying:

- Instance variables. (set of values)
- Methods. (operations defined on those values)
- Constructors. (create and initialize new objects)

Point Charge Data Type

Goal. Create a data type to manipulate point charges.

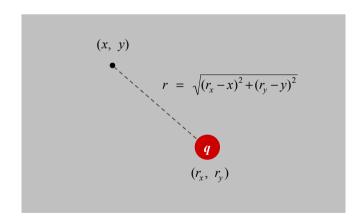
Set of values. Three real numbers. [position and electrical charge]

Operations.

- Create a new point charge at (r_x, r_y) with electric charge q.
- Determine electric potential V at (x, y) due to point charge.
- Convert to string.

$$V = k \frac{q}{r}$$

r = distance between (x, y) and (r_x, r_y) k = electrostatic constant = $8.99 \times 10^9 \text{ N} \cdot \text{m}^2/\text{C}^2$



Point Charge Data Type

Goal. Create a data type to manipulate point charges.

Set of values. Three real numbers. [position and electrical charge]

API.

```
public class Charge
```

```
Charge(double x0, double y0, double q0)

double potentialAt(double x, double y) electric potential at (x, y) due to charge

String toString() string representation
```

Charge Data Type: A Simple Client

Client program. Uses data type operations to calculate something.

```
public static void main(String[] args) {
    double x = Double.parseDouble(args[0]);
    double y = Double.parseDouble(args[1]);
    Charge c1 = new Charge(.51, .63, 21.3);
    Charge c2 = new Charge(.13, .94, 81.9);
    double v1 = c1.potentialAt(x, y);
    double v2 = c2.potentialAt(x, y);
    StdOut.println(c1);
    StdOut.println(c2);
    automagically invokes
    the toString() method
    StdOut.println(v1 + v2);
}
```

```
% java Charge .50 .50
21.3 at (0.51, 0.63)
81.9 at (0.13, 0.94)
2.74936907085912e12
```

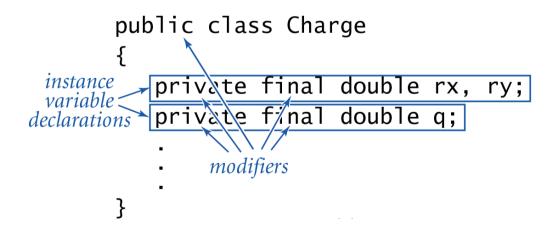
Anatomy of Instance Variables

Instance variables. Specifies the set of values.

- Declare outside any method.
- Always use access modifier private.

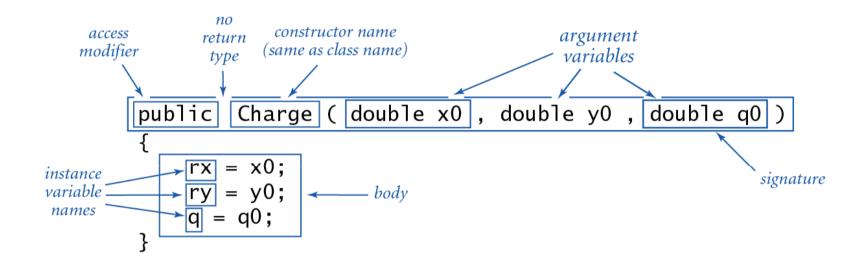
Use modifier final with instance variables that never change.

stay tuned



Anatomy of a Constructor

Constructor. Specifies what happens when you create a new object.



Calling a constructor. Use new operator to create a new object.

```
create and initialize object

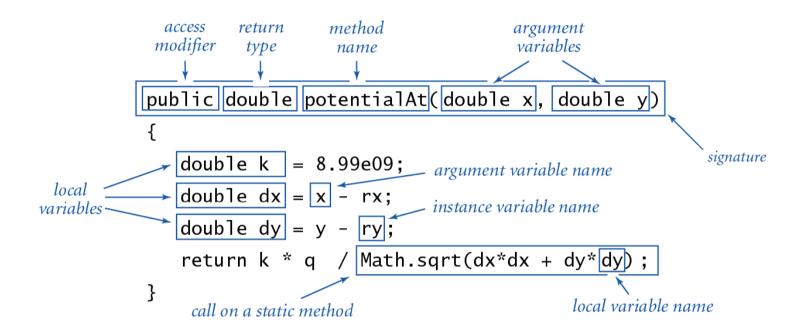
Charge c1 = new Charge(.51, .63, 21.3);

Charge c2 = new Charge(.13, .94, 81.9);

invoke constructor
```

Anatomy of an Instance Method

Instance method. Define operations on instance variables.



Invoking an instance method. Use dot operator to invoke a method.

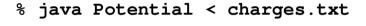
Anatomy of a Class

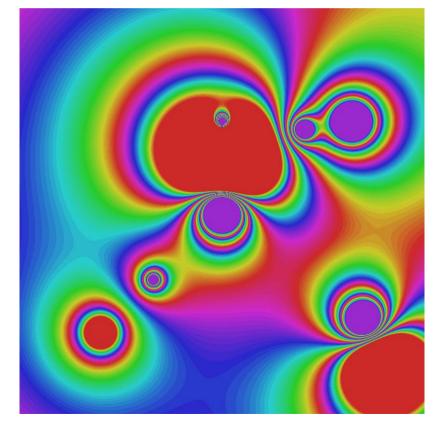
```
public class Charge -
                                                          class
               private final double rx, ry;
 instance
 variables
               private final double q:
               public Charge (double x0, double y0, double q0)
constructor
               \{ rx = x0; ry = y0; q = q0; \}
               public double potentialAt(double x, double y)
                                                            instance
                                                            variable
                  double k = 8.99e09;
                                                            names
                  double dx = x - rx:
                  double dy = y - ry;
                  return k * q / Math.sqrt(dx*dx + dy*dy)
 instance
 methods
               public String toString()
               { return q +" at " + "("+ rx + ", " + ry +")";
               public static void main(String[] args)
test client
                  double x = Double.parseDouble(args[0]);
                  double y = Double.parseDouble(args[1]);
     create
                  Charge c1 = new Charge(.51, .63, 21.3);
      and
    initialize
                  Charge c2 = new Charge(.13, .94, 81.9);
     object
                  double v1 = c1.potentialAt(x, y);
                                                             invoke
                  double v2 = c2.potentialAt(x, y);
                                                           constructor
                  StdOut.printf("%.1e\n", (v1 + v2));
                                                       invoke
                        object
                                                       method
                        name
```

Potential Visualization

Potential visualization. Read in N point charges from standard input; compute total potential at each point in unit square.

% more charges.txt
9
.51 .63 -100
.50 .50 40
.50 .72 10
.33 .33 5
.20 .20 -10
.70 .70 10
.82 .72 20
.85 .23 30
.90 .12 -50





Potential Visualization

Arrays of objects. Allocate memory for the array with new; then allocate memory for each individual object with new.

```
% more charges.txt
9
.51 .63 -100
.50 .50 40
.50 .72 10
.33 .33 5
.20 .20 -10
.70 .70 10
.82 .72 20
.85 .23 30
.90 .12 -50
```

```
// read in the data
int N = StdIn.readInt();
Charge[] a = new Charge[N];
for (int i = 0; i < N; i++) {
   double x0 = StdIn.readDouble();
   double y0 = StdIn.readDouble();
   double q0 = StdIn.readDouble();
   a[i] = new Charge(x0, y0, q0);
}</pre>
```

Potential Visualization

```
// plot the data
int SIZE = 512;
Picture pic = new Picture(SIZE, SIZE);
for (int i = 0; i < SIZE; i++) {</pre>
   for (int j = 0; j < SIZE; j++) {
       double V = 0.0;
       for (int k = 0; k < N; k++) {
                                              V = \sum (k q_k / r_k)
          double x = 1.0 * i / SIZE;
          double y = 1.0 * j / SIZE;
          V += a[k].potentialAt(x, y);
       Color color = getColor(V);
                                             compute color as a
                                             function of potential V
      pic.set(i, SIZE-1-j, color);
                           (0, 0) is upper left
pic.show();
```

Turtle Graphics

Turtle Graphics

Goal. Create a data type to manipulate a turtle moving in the plane. Set of values. Location and orientation of turtle.

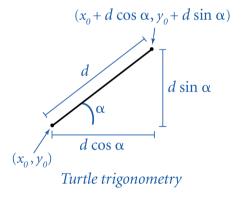
API. public class Turtle

```
Turtle(double x0, double y0, double a0) \frac{create\ a\ new\ turtle\ at\ (x_0,y_0)\ facing\ a_0}{degrees\ counterclockwise\ from\ the\ x-axis} void turnLeft(double delta) \frac{create\ a\ new\ turtle\ at\ (x_0,y_0)\ facing\ a_0}{degrees\ counterclockwise\ from\ the\ x-axis} void goForward(double step) \frac{create\ a\ new\ turtle\ at\ (x_0,y_0)\ facing\ a_0}{degrees\ counterclockwise\ from\ the\ x-axis}
```

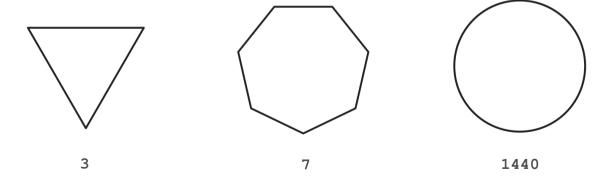
```
// draw a square
Turtle turtle = new Turtle(0.0, 0.0, 0.0);
turtle.goForward(1.0);
turtle.turnLeft(90.0);
turtle.goForward(1.0);
turtle.turnLeft(90.0);
turtle.goForward(1.0);
turtle.turnLeft(90.0);
turtle.turnLeft(90.0);
turtle.turnLeft(90.0);
```

Turtle Graphics

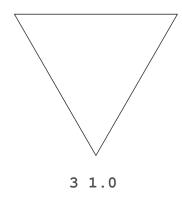
```
public class Turtle {
   private double x, y; // turtle is at (x, y)
   private double angle; // facing this direction
   public Turtle(double x0, double y0, double a0) {
      x = x0;
      y = y0;
      angle = a0;
   public void turnLeft(double delta) {
      angle += delta;
   public void goForward(double d) {
      double oldx = x;
      double oldy = y;
      x += d * Math.cos(Math.toRadians(angle));
      y += d * Math.sin(Math.toRadians(angle));
      StdDraw.line(oldx, oldy, x, y);
```



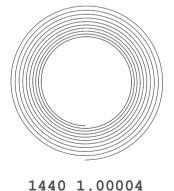
N-gon

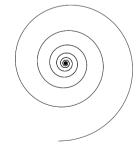


Spira Mirabilis









Spira Mirabilis in Nature







Complex Numbers

Complex Number Data Type

Goal. Create a data type to manipulate complex numbers. Set of values. Two real numbers: real and imaginary parts.

API.

public class Complex

```
Complex (double real, double imag)

Complex plus (Complex b) sum of this number and b

Complex times (Complex b) product of this number and b

double abs() magnitude

String toString() string representation
```

$$a = 3 + 4i, b = -2 + 3i$$

 $a + b = 1 + 7i$
 $a \times b = -18 + i$
 $|a| = 5$

Applications of Complex Numbers

Relevance. A quintessential mathematical abstraction.

Applications.

- Fractals.
- Impedance in RLC circuits.
- Signal processing and Fourier analysis.
- Control theory and Laplace transforms.
- Quantum mechanics and Hilbert spaces.

...

Complex Number Data Type: A Simple Client

Client program. Uses data type operations to calculate something.

```
public static void main(String[] args) {
   Complex a = new Complex( 3.0, 4.0);
   Complex b = new Complex(-2.0, 3.0);
   Complex c = a.times(b);
   StdOut.println("a = " + a);
   StdOut.println("b = " + b);
   StdOut.println("c = " + c);
}

   * java TestClient
   a = 3.0 + 4.0i
   b = -2.0 + 3.0i
   c = -18.0 + 1.0i
```

Remark. Can't write c = a * b since no operator overloading in Java.

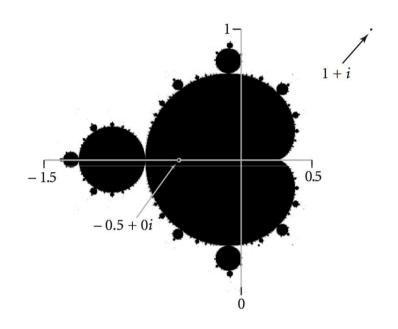
Complex Number Data Type: Implementation

```
public class Complex {
   private final double re;
   private final double im;
                                    instance variables
   public Complex(double real, double imag) {
      re = real;
      im = imag;
                                           constructor
   public String toString() { return re + " + " + im + "i"; }
   public double abs() { return Math.sqrt(re*re + im*im); }
   public Complex plus(Complex b) {
      double real = re + b.re;
                                          creates a Complex object, and returns a reference to it
      double imag = im + b.im;
      return new Complex(real, imag);
                                              refers to b's instance variable
   public Complex times(Complex b) {
      double real = re * b.re - im * b.im;
      double imag = re * b.im + im * b.re;
      return new Complex(real, imag);
                                                               methods
```

Mandelbrot Set

Mandelbrot set. A set of complex numbers.

Plot. Plot (x, y) black if z = x + y i is in the set, and white otherwise.

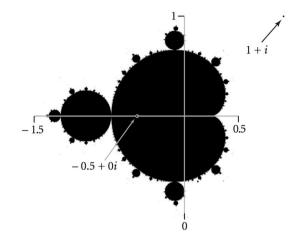


- No simple formula describes which complex numbers are in set.
- Instead, describe using an algorithm.

Mandelbrot Set

Mandelbrot set. Is complex number z_0 in the set?

- Iterate $z_{t+1} = (z_t)^2 + z_0$.
- If $|z_t|$ diverges to infinity, then z_0 is not in set; otherwise z_0 is in set.



t	z _t
0	-1/2 + 0i
1	-1/4 + 0i
2	-7/16 + Oi
3	-79/256 + 0i
4	-26527/65536 + 0i
5	-1443801919/4294967296 + 0i

z = -1/2 is in Mandelbrot set

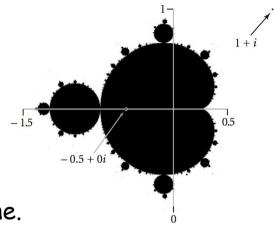
t	z _t
0	1 + i
1	1 + 3i
2	-7 + 7i
3	1 - 97i
4	-9407 - 193i
5	88454401 + 3631103i

z = 1 + i not in Mandelbrot set

Plotting the Mandelbrot Set

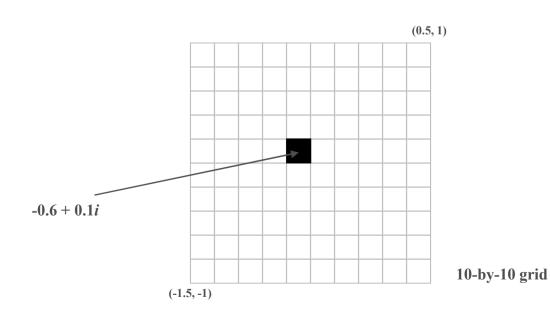
Practical issues.

- Cannot plot infinitely many points.
- Cannot iterate infinitely many times.



Approximate solution.

- Sample from an N-by-N grid of points in the plane.
- Fact: if $|z_t| > 2$ for any t, then z not in Mandelbrot set.
- Pseudo-fact: if $|z_{255}| \le 2$ then z "likely" in Mandelbrot set.



Complex Number Data Type: Another Client

Mandelbrot function with complex numbers.

- Is z_0 in the Mandelbrot set?
- Returns white (definitely no) or black (probably yes).

```
public static Color mand(Complex z0) {
   Complex z = z0;
   for (int t = 0; t < 255; t++) {
      if (z.abs() > 2.0) return StdDraw.WHITE;
      z = z.times(z);
      z = z.plus(z0);
   }
   return StdDraw.BLACK;
}
```

More dramatic picture: replace stadraw. WHITE with grayscale or color.

```
new Color(255-t, 255-t, 255-t)
```

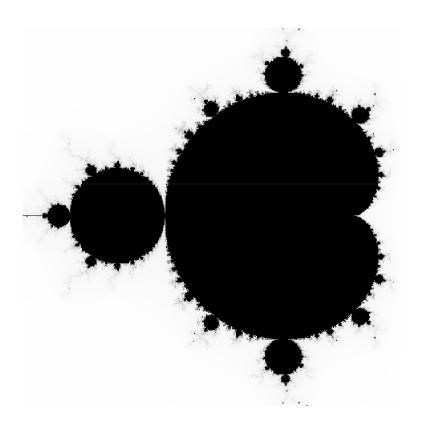
Complex Number Data Type: Another Client

Plot the Mandelbrot set in gray scale.

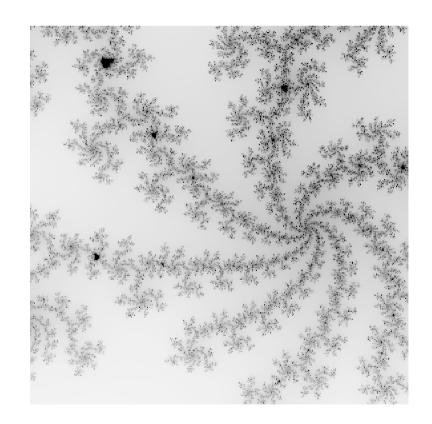
```
public static void main(String[] args) {
   double xc = Double.parseDouble(args[0]);
   double yc = Double.parseDouble(args[1]);
   double size = Double.parseDouble(args[2]);
   int N = 512;
   Picture pic = new Picture(N, N);
   for (int i = 0; i < N; i++) {</pre>
      for (int j = 0; j < N; j++) {
         double x0 = xc - size/2 + size*i/N;
         double y0 = yc - size/2 + size*j/N;
         Complex z0 = new Complex(x0, y0); 
         Color color = mand(z0);
                                               scale to screen
         pic.set(i, N-1-j, color);
                                               coordinates
                          (0, 0) is upper left
   pic.show();
```

Mandelbrot Set

% java Mandelbrot -.5 0 2

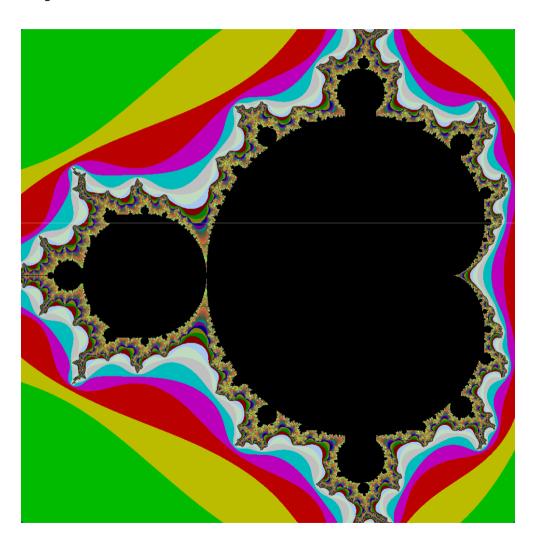


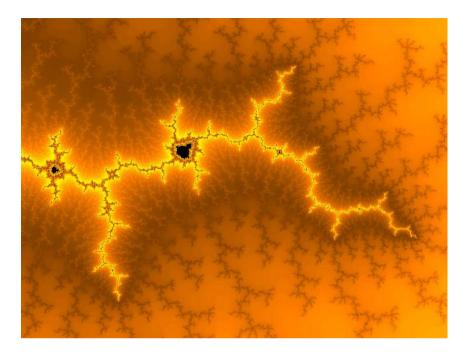
% java Mandelbrot .1045 -.637 .01

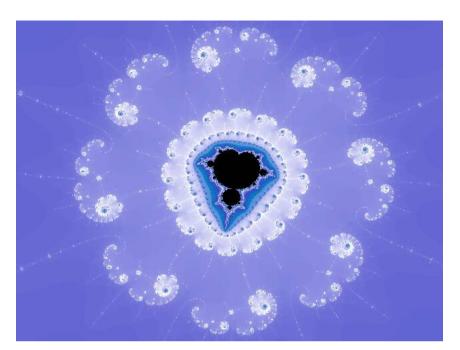


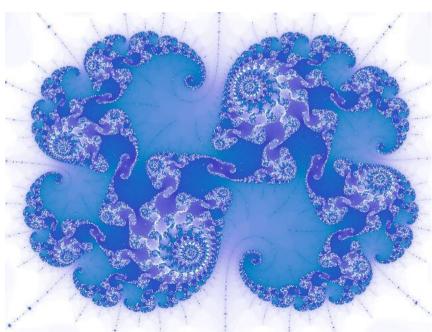
Mandelbrot Set

% java ColorMandelbrot -.5 0 2 < mandel.txt</pre>

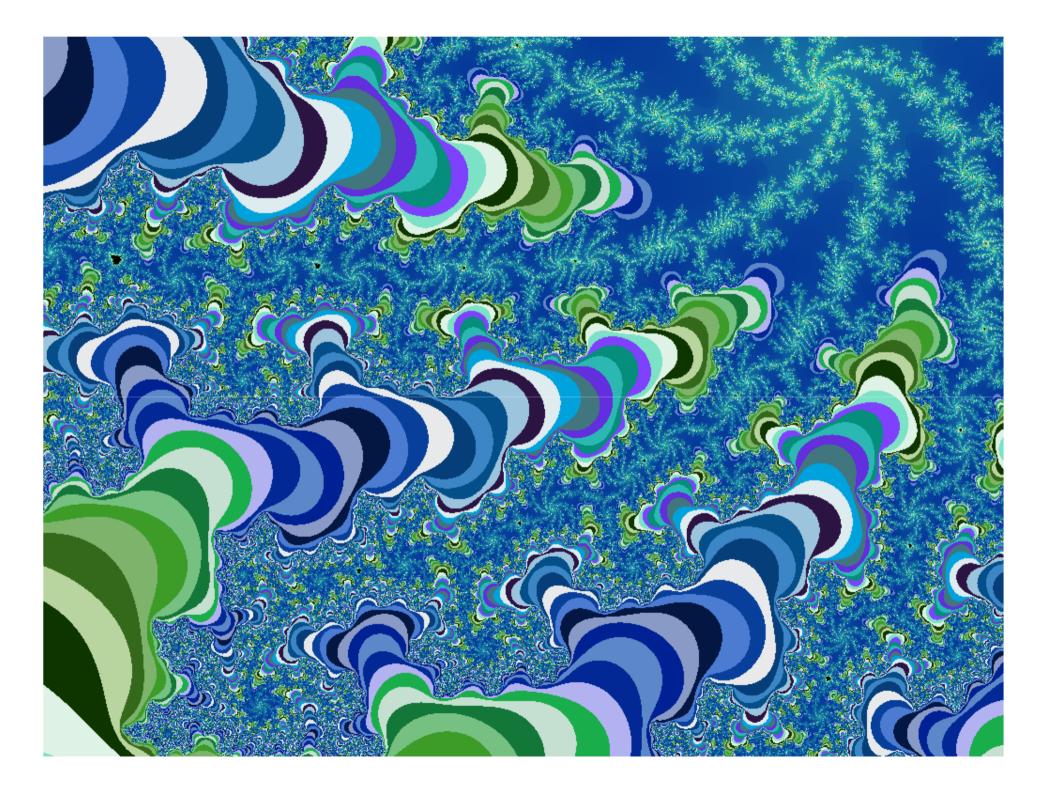




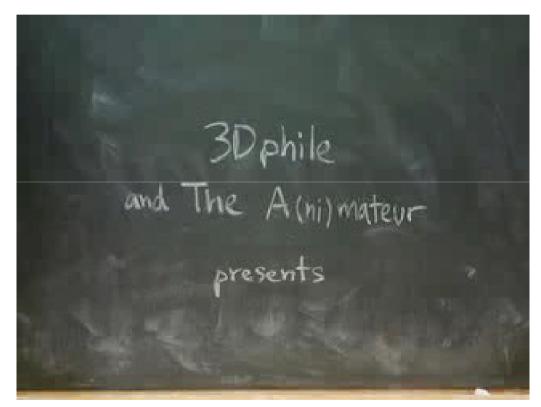








Mandelbrot Set Music Video



http://www.jonathancoulton.com/songdetails/Mandelbrot Set

Applications of Data Types

Data type. Set of values and collection of operations on those values.

Simulating the physical world.

- Java objects model real-world objects.
- Not always easy to make model reflect reality.
- Ex: charged particle, molecule, COS 126 student,

Extending the Java language.

- Java doesn't have a data type for every possible application.
- Data types enable us to add our own abstractions.
- Ex: complex, vector, polynomial, matrix,

3.2 Extra Slides

Example: Bouncing Ball in Unit Square

Bouncing ball. Model a bouncing ball moving in the unit square with constant velocity.

Example: Bouncing Ball in Unit Square

```
public class Ball {
                                                      Ball. java
   private double rx, ry;
                            ← instance variables
   private double vx, vy;
   private double radius;
   public Ball() {
                                                   constructor
      rx = ry = 0.5;
      vx = 0.015 - Math.random() * 0.03;
      vy = 0.015 - Math.random() * 0.03;
      radius = 0.01 + Math.random() * 0.01;
   public void move() {
      if ((rx + vx > 1.0) \mid | (rx + vx < 0.0)) vx = -vx;
      if ((ry + vy > 1.0) | | (ry + vy < 0.0)) vy = -vy;
      rx = rx + vx;
                                                   bounce
      ry = ry + vy;
   public void draw() {
      StdDraw.filledCircle(rx, ry, radius);
                                                     methods
```

Object reference.

- Allow client to manipulate an object as a single entity.
- Essentially a machine address (pointer).

```
Ball b1 = new Ball();
b1.move();
b1.move();

Ball b2 = new Ball();
b2.move();

b2 = b1;
b2.move();
```

addr	value
C0	0
C1	0
C2	0
С3	0
C4	0
C5	0
C6	0
C7	0
C8	0
С9	0
CA	0
CB	0
CC	0

Object reference.

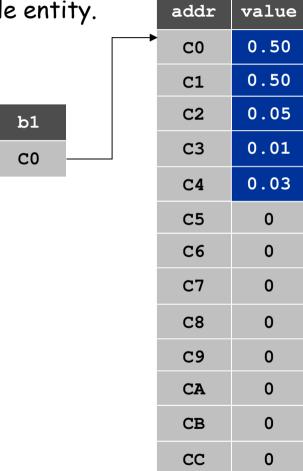
Allow client to manipulate an object as a single entity.

Essentially a machine address (pointer).

```
Ball b1 = new Ball();
b1.move();
b1.move();

Ball b2 = new Ball();
b2.move();

b2 = b1;
b2.move();
```



registers

Object reference.

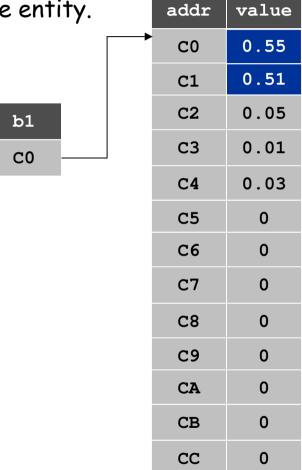
Allow client to manipulate an object as a single entity.

Essentially a machine address (pointer).

```
Ball b1 = new Ball();
b1.move();
b1.move();

Ball b2 = new Ball();
b2.move();

b2 = b1;
b2.move();
```



registers

Object reference.

Allow client to manipulate an object as a single entity

Essentially a machine address (pointer).

```
Ball b1 = new Ball();
b1.move();

b1.move();

Ball b2 = new Ball();
b2.move();

b2 = b1;
b2.move();
```

e entity.	addr	value
	C0	0.60
	C1	0.52
b1	C2	0.05
C0	С3	0.01
	C4	0.03
	C5	0
	C6	0
	C7	0
	C8	0
	С9	0
	CA	0
	CB	0
	CC	0

registers

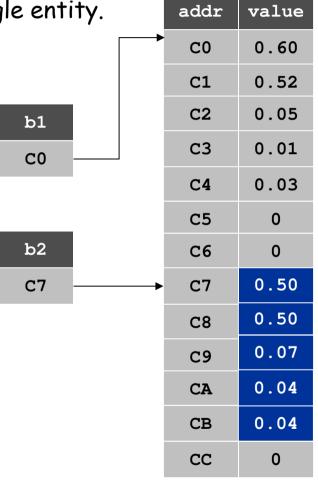
Object reference.

Allow client to manipulate an object as a single entity.

Essentially a machine address (pointer).

```
Ball b1 = new Ball();
b1.move();
b1.move();

Ball b2 = new Ball();
b2.move();
b2 = b1;
b2.move();
```



registers

Object reference.

Allow client to manipulate an object as a single entity.

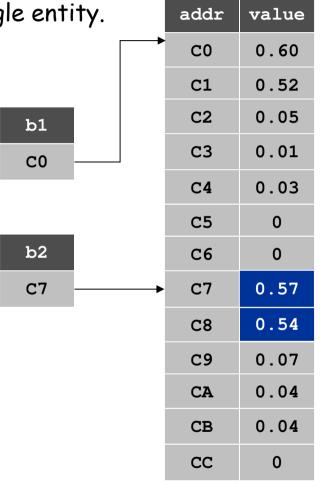
Essentially a machine address (pointer).

```
Ball b1 = new Ball();
b1.move();
b1.move();

Ball b2 = new Ball();

b2.move();

b2 = b1;
b2.move();
```



registers

Object reference.

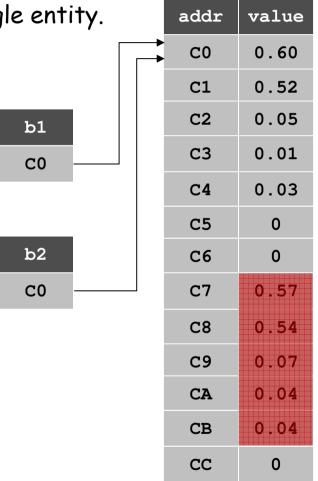
Allow client to manipulate an object as a single entity.

Essentially a machine address (pointer).

```
Ball b1 = new Ball();
b1.move();
b1.move();

Ball b2 = new Ball();
b2.move();
```

Data stored in C7 - CB for abstract bit recycler.



registers

Object reference.

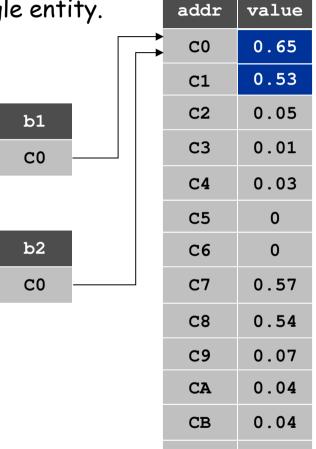
Allow client to manipulate an object as a single entity.

Essentially a machine address (pointer).

```
Ball b1 = new Ball();
b1.move();
b1.move();

Ball b2 = new Ball();
b2.move();
```

Moving b2 also moves b1 since they are aliases that reference the same object.



registers

main memory (64-bit machine)

0

CC

Creating Many Objects

Each object is a data type value.

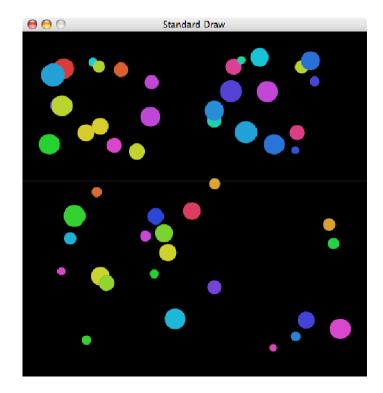
- Use new to invoke constructor and create each one.
- Ex: create N bouncing balls and animate them.

```
public class BouncingBalls {
   public static void main(String[] args) {
      int N = Integer.parseInt(args[0]);
                                                      create and initialize
      Ball balls[] = new Ball[N];
                                                      N objects
      for (int i = 0; i < N; i++)</pre>
         balls[i] = new Ball();
                                                      animation loop
      while(true) {
          StdDraw.clear();
          for (int i = 0; i < N; i++) {</pre>
             balls[i].move();
             balls[i].draw();
          StdDraw.show(20);
```

50 Bouncing Balls

Color. Associate a color with each ball; paint background black.

% java BouncingBalls 50



Scientific variations. Account for gravity, spin, collisions, drag, ...

OOP Context

Reference. Variable that stores the name of a thing.

Thing	Name
Web page	www.princeton.edu
Bank account	45-234-23310076
Word of TOY memory	1C
Byte of computer memory	00FACADE
Home	35 Olden Street

Some consequences.

- Assignment statements copy references (not objects).
- The == operator tests if two references refer to same object.
- Pass copies of references (not objects) to functions.
 - efficient since no copying of data
 - function can change the object

Using a Data Type in Java

Client. A sample client program that uses the Point data type.

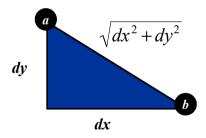
```
public class PointTest {
   public static void main(String[] args) {
      Point a = new Point();
      Point b = new Point();
      double distance = a.distanceTo(b);
      StdOut.println("a = " + a);
      StdOut.println("b = " + b);
      StdOut.println("distance = " + distance);
   }
}
```

```
% java PointTest
a = (0.716810971264761, 0.0753539063358446)
b = (0.4052136795358151, 0.033848435224524076)
distance = 0.31434944941098036
```

Points in the Plane

Data type. Points in the plane.

```
public class Point {
   private double x;
   private double y;
   public Point() {
      x = Math.random();
      y = Math.random();
   public String toString() {
      return "(" + x + ", " + y + ")";
   public double distanceTo(Point p) {
      double dx = x - p.x;
      double dy = y - p.y;
      return Math.sqrt(dx*dx + dy*dy);
```



A Compound Data Type: Circles

Goal. Data type for circles in the plane.

```
public class Circle {
   private Point center;
   private double radius;
   public Circle(Point center, double radius) {
      this.center = center;
      this.radius = radius;
                                                     center
   public boolean contains(Point p) {
      return p.dist(center) <= radius;</pre>
   public double area() {
      return Math.PI * radius * radius;
   public boolean intersects(Circle c) {
      return center.dist(c.center) <= radius + c.radius;</pre>
```

Pass-By-Value

Arguments to methods are always passed by value.

- Primitive types: passes copy of value of actual parameter.
- Objects: passes copy of reference to actual parameter.

```
public class PassByValue {
   static void update(int a, int[] b, String c) {
           = 7:
     b[3] = 7;
           = "seven";
      StdO.println(a + " " + b[3] + " " + c);
   public static void main(String[] args) {
      int a = 3;
      int[] b = { 0, 1, 2, 3, 4, 5 };
      String c = "three";
      StdOut.println(a + " " + b[3] + " " + c);
      update(a, b, c);
      StdOut.println(a + " " + b[3] + " " + c);
                                           % java PassByValue
                                           3 3 three
                                           7 7 seven
                                           3 7 three
```

Object Oriented Programming

Procedural programming. [verb-oriented]

- Tell the computer to do this.
- Tell the computer to do that.

OOP philosophy. Software is a simulation of the real world.

- We know (approximately) how the real world works.
- Design software to model the real world.

Objected oriented programming (OOP). [noun-oriented]

- Programming paradigm based on data types.
- Identify objects that are part of the problem domain or solution.
- Identity: objects are distinguished from other objects (references).
- State: objects know things (instance variables).
- Behavior: objects do things (methods).

Alan Kay

Alan Kay. [Xerox PARC 1970s]

- Invented Smalltalk programming language.
- Conceived Dynabook portable computer.
- Ideas led to: laptop, modern GUI, OOP.



- "The computer revolution hasn't started yet."
- "The best way to predict the future is to invent it."
- "If you don't fail at least 90 per cent of the time, you're not aiming high enough."

— Alan Kay



Alan Kay 2003 Turing Award

Encapsulation

Encapsulation

Data type. Set of values and operations on those values.

Ex. int, String, Complex, Vector, Document, GuitarString, ...

Encapsulated data type. Hide internal representation of data type.

Separate implementation from design specification.

- Class provides data representation and code for operations.
- Client uses data type as black box.
- API specifies contract between client and class.

Bottom line. You don't need to know how a data type is implemented in order to use it.

Intuition



Client



API

- volume
- change channel
- adjust picture
- decode NTSC signal



Implementation

- cathode ray tube
- electron gun
- Sony Wega 36XBR250
- 241 pounds

client needs to know how to use API

implementation needs to know what API to implement

Implementation and client need to agree on API ahead of time.

Intuition



Client



API

- volume
- change channel
- adjust picture
- decode NTSC signal



Implementation

- gas plasma monitor
- Samsung FPT-6374
- wall mountable
- 4 inches deep

client needs to know how to use API

implementation needs to know what API to implement

Can substitute better implementation without changing the client.

Counter Data Type

Counter. Data type to count electronic votes.

```
public class Counter {
    public int count;
    public final String name;

    public Counter(String id) { name = id; }
    public void increment() { count++; }
    public int value() { return count; }
}
```

Legal Java client.

```
Counter c = new Counter("Volusia County");
c.count = -16022;
```

Oops. Al Gore receives -16,022 votes in Volusia County, Florida.

Counter Data Type

Counter. Encapsulated data type to count electronic votes.

```
public class Counter {
    private int count;
    private final String name;

    public Counter(String id) { name = id; }
    public void increment() { count++; }
    public int value() { return count; }
}
```

Does not compile.

```
Counter c = new Counter("Volusia County");
c.count = -16022;
```

Benefit. Can guarantee that each data type value remains in a consistent state.

Changing Internal Representation

Encapsulation.

- Keep data representation hidden with private access modifier.
- Expose API to clients using public access modifier.

```
public class Complex {
   private final double re, im;

   public Complex(double re, double im) { ... }
   public double abs() { ... }
   public Complex plus(Complex b) { ... }
   public Complex times(Complex b) { ... }
   public String toString() { ... }
}
```

e.g., to polar coordinates

Advantage. Can switch internal representation without changing client. Note. All our data types are already encapsulated!

Time Bombs

Internal representation changes.

- [Y2K] Two digit years: January 1, 2000.
- [Y2038] 32-bit seconds since 1970: January 19, 2038.
- [VIN numbers] We'll run out by 2010.



www.cartoonstock.com/directory/m/millenium_time-bomb.asp

Lesson. By exposing data representation to client, might need to sift through millions of lines of code in client to update.

Ask, Don't Touch

Encapsulated data types.

- Don't touch data and do whatever you want.
- Instead, ask object to manipulate its data.

"Ask, don't touch."



Adele Goldberg Former president of ACM Co-developed Smalltalk

Lesson. Limiting scope makes programs easier to maintain and understand.

"principle of least privilege"

Immutability

Immutability

Immutable data type. Object's value cannot change once constructed.

mutable	immutable
Picture	Charge
Histogram	Color
Turtle	Stopwatch
StockAccount	Complex
Counter	String
Java arrays	primitive types

Immutability: Advantages and Disadvantages

Immutable data type. Object's value cannot change once constructed.

Advantages.

- Avoid aliasing bugs.
- Makes program easier to debug.
- Limits scope of code that can change values.
- Pass objects around without worrying about modification.

Disadvantage. New object must be created for every value.

Final Access Modifier

Final. Declaring an instance variable to be final means that you can assign it a value only once, in initializer or constructor.

```
public class Counter {
    private final String name;
    private int count;
    this value doesn't change once the object is constructed
}

this value changes by invoking instance method
```

Advantages.

- Helps enforce immutability.
- Prevents accidental changes.
- Makes program easier to debug.
- Documents that the value cannot not change.

Spatial Vectors

Vector Data Type

Set of values. Sequence of real numbers. [Cartesian coordinates]

API. public class Vector

Vector (double[] a) create a vector with the given Cartesian coordinates

Vector plus(Vector b) sum of this vector and b

Vector minus(Vector b) difference of this vector and b

Vector times(double t) scalar product of this vector and t

double dot(Vector b) dot product of this vector and b

double magnitude() magnitude of this vector

Vector direction() unit vector with same direction as this vector

$$x = (0, 3, 4, 0), \quad y = (0, -3, 1, -4)$$

$$x + y = (0, 0, 5, -4)$$

$$3x = (0, 9, 12, 0)$$

$$x \cdot y = (0 \times 0) + (3 \times -3) + (4 \times 1) + (0 \times -4) = -5$$

$$|x| = (0^2 + 3^2 + 4^2 + 0^2)^{1/2} = 5$$

$$x = x / |x| = (0, 0.6, 0.8, 0)$$

Vector Data Type Applications

Relevance. A quintessential mathematical abstraction.

Applications.

- Statistics.
- Linear algebra.
- Clustering and similarity search.
- Force, velocity, acceleration, momentum, torque.

...

Vector Data Type: Implementation

```
public class Vector {
   private int N;
   private double[] coords;
                                            instance variables
   public Vector(double[] a) {
      N = a.length;
      coords = new double[N];
      for (int i = 0; i < N; i++)
          coords[i] = a[i];
                                                constructor
   public double dot(Vector b) {
      double sum = 0.0;
      for (int i = 0; i < N; i++)</pre>
          sum += (coords[i] * b.coords[i]);
      return sum;
   public Vector plus(Vector b) {
      double[] c = new double[N];
      for (int i = 0; i < N; i++)</pre>
          c[i] = coords[i] + b.coords[i];
                                                  methods
      return new Vector(c);
```

Vector Data Type: Implementation

```
public Vector times(double t) {
   double[] c = new double[N];
   for (int i = 0; i < N; i++)
      c[i] = t * coords[i];
   return new Vector(c);
public double magnitude() {
   return Math.sqrt(this.dot(this));
public Vector direction() {
   return this.times(1.0 / this.magnitude());
```

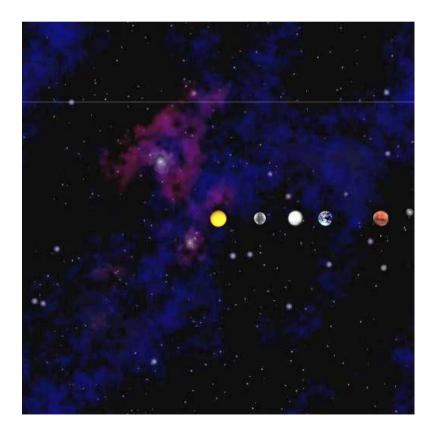
This. The keyword this is a reference to the invoking object. Ex. When you invoke a .magnitude (), this is an alias for a.

N-body Simulation

N-Body Problem

Goal. Determine the motion of N particles, moving under their mutual Newtonian gravitational forces.

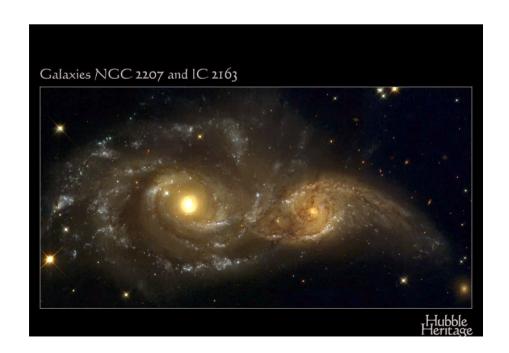
Ex. Planets orbit the sun.



N-Body: Applications

Applications to astrophysics.

- Orbits of solar system bodies.
- Stellar dynamics at the galactic center.
- Stellar dynamics in a globular cluster.
- Stellar dynamics during the collision of two galaxies.
- Formation of structure in the universe.
- Dynamics of galaxies during cluster formation.



N-Body Problem

Goal. Determine the motion of N particles, moving under their mutual Newtonian gravitational forces.

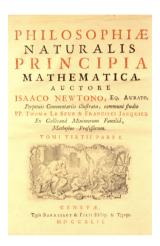
Context. Newton formulated the physical principles in Principia.

$$F = ma$$

Newton's second law of motion

$$F = \frac{G m_1 m_2}{r^2}$$

Newton's law of universal gravitation





Kepler



Bernoulli



Newton



Euler



Lagrange



Delaunay

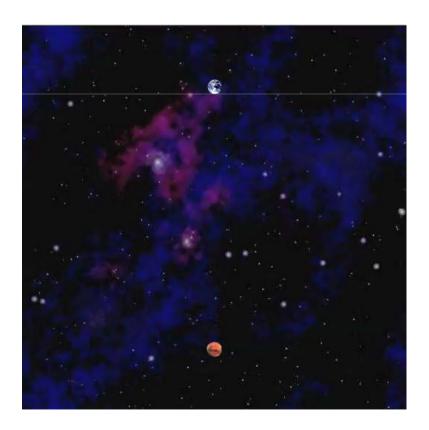


Poincaré

2-Body Problem

2 body problem.

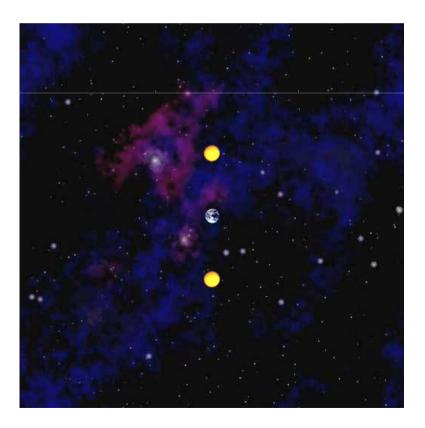
- Can be solved analytically via Kepler's 3rd law.
- Bodies move around a common barycenter (center-of-mass) with elliptical orbits.



3-Body Problem

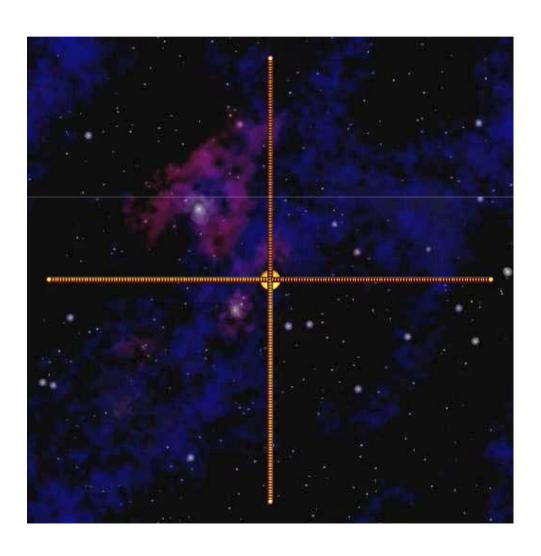
3-body problem. No solution possible in terms of elementary functions; moreover, orbits may not be stable or periodic!

Consequence. Must resort to computational methods.



N-Body Simulation

N-body simulation. The ultimate object-oriented program: simulate the universe.



Body Data Type

Body data type. Represent a particle.

```
Body(Vector r, Vector v, double mass)

void move(Vector f, double dt) apply force f, move body for dt seconds

void draw() draw the ball

Vector forceFrom(Body b) force vector between this body and b
```

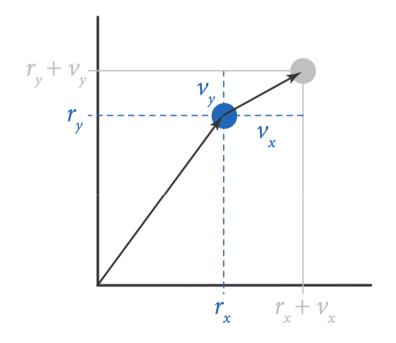
Vector notation. Represent position, velocity, and force using vector.

```
public class Body {
   private Vector r;  // position
   private Vector v;  // velocity
   private double mass;  // mass
```

instance variables

Moving a Body

Moving a body. Assuming no other forces, body moves in straight line.



$$r_x = r_x + dt \cdot v_x$$

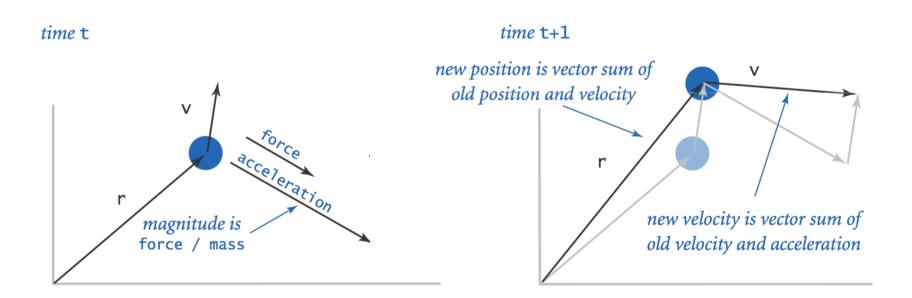
 $r_y = r_y + dt \cdot v_y$

$$r_y = r_y + dt \cdot v_y$$

Moving a Body

Moving a body.

- Given external force F, acceleration a = F/m.
- Use acceleration (assume fixed) to compute change in velocity.
- Use velocity to compute change in position.

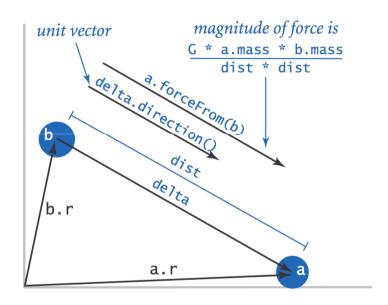


```
Vector a = f.times(1/mass);
v = v.plus(a.times(dt));
r = r.plus(v.times(dt));
```

Force Between Two Bodies

Newton's law of universal gravitation.

- $F = G m_1 m_2 / r^2$.
- Direction of force is line between two particles.



```
double G = 6.67e-11;
Vector delta = a.r.minus(b.r);
double dist = delta.magnitude();
double F = (G * a.mass * b.mass) / (dist * dist);
Vector force = delta.direction().times(F);
```

Body Data Type: Java Implementation

```
public class Body {
   private Vector r;
                    // position
   private Vector v; // velocity
   private double mass; // mass
   public Body(Vector r, Vector v, double mass) {
      this.r = r;
      this.v = v;
      this.mass = mass;
   public void move(Vector f, double dt) {
      Vector a = f.times(1/mass);
      v = v.plus(a.times(dt));
      r = r.plus(v.times(dt));
   public Vector forceFrom(Body that) {
      double G = 6.67e-11;
      Vector delta = that.r.minus(this.r);
      double dist = delta.magnitude();
      double F = (G * this.mass * that.mass) / (dist * dist);
      return delta.direction().times(F);
   public void draw() {
      StdDraw.setPenRadius(0.025);
      StdDraw.point(r.cartesian(0), r.cartesian(1));
```

Universe Data Type

Universe data type. Represent a universe of N particles.

```
public static void main(String[] args) {
   Universe newton = new Universe();
   double dt = Double.parseDouble(args[0]);
   while (true) {
       StdDraw.clear();
       newton.increaseTime(dt);
       newton.draw();
       StdDraw.show(10);
   }
}

main simulation loop
```

Universe Data Type

Universe data type. Represent a universe of N particles.

instance variables

Data-Driven Design

File format.

Constructor.

```
public Universe() {
   N = StdIn.readInt();
   radius = StdIn.readDouble();
   StdDraw.setXscale(-radius, +radius);
   StdDraw.setYscale(-radius, +radius);
   // read in the N bodies
   orbs = new Body[N];
   for (int i = 0; i < N; i++) {
      double rx
                  = StdIn.readDouble();
      double ry
                  = StdIn.readDouble();
                  = StdIn.readDouble();
      double vx
      double vy
                  = StdIn.readDouble();
      double mass = StdIn.readDouble();
      double[] position = { rx, ry };
      double[] velocity = { vx, vy };
      Vector r = new Vector(position);
      Vector v = new Vector(velocity);
      orbs[i] = new Body(r, v, mass);
```

Principle of Superposition

Principle of superposition. Net gravitational force acting on a body is the sum of the individual forces.

```
// compute the forces
for (int i = 0; i < N; i++) {
   for (int j = 0; j < N; j++) {
      if (i != j) {
        f[i] = f[i].plus(orbs[i].forceFrom(orbs[j]));
      }
   }
}</pre>
```

$$F_i = \sum_{i \neq j} \frac{G m_i m_j}{|r_i - r_j|^2}$$

Universe Data Type: Java Implementation

```
public class Universe {
  private final double radius;
                                // radius of universe
  private final int N;
                                // number of bodies
  create
  public Universe() { /* see previous slide */ }
                                                               universe
  public void increaseTime(double dt) {
     Vector[] f = new Vector[N];
     for (int i = 0; i < N; i++)
         f[i] = new Vector(new double[2]);
     for (int i = 0; i < N; i++)
                                                               update
         for (int j = 0; j < N; j++)
                                                              the bodies
             if (i != j)
                 f[i] = f[i].plus(orbs[i].forceTo(orbs[i]));
     for (int i = 0; i < N; i++)
        orbs[i].move(f[i], dt);
  public void draw() {
                                  draw the bodies
     for (int i = 0; i < N; i++)
        orbs[i].draw();
                                                    simulate the universe
  public static void main(String[] args) { /* see previous slide */ }
```

Odds and Ends

Accuracy. How small to make dt? How to avoid floating-point inaccuracies from accumulating?

Efficiency.

- Direct sum: takes time proportional to N^2
 - \Rightarrow not usable for large N.
- Appel / Barnes-Hut: takes time proportional to N log N time
- \bullet \Rightarrow can simulate large universes.

3D universe. Use a 3D vector (only drawing code changes!).

Collisions.

- Model inelastic collisions.
- Use a softening parameter to avoid collisions.

$$F_{i} = \sum_{i \neq j} \frac{G m_{i} m_{j}}{|r_{i} - r_{j}|^{2} + \varepsilon^{2}}$$

Extra Slides

N-Body Simulation

- 1. Setup initial distribution of particles.
 - Need accurate data and model of mass distribution.

- 2. Compute forces between particles.
 - Direct sum: N².
 - Appel / Barnes-Hut" N log N.

$$\mathbf{F}_i = \sum_{i \neq j} \frac{Gm_i m_j}{|\mathbf{r}_i - \mathbf{r}_j|^2 + \epsilon^2}$$

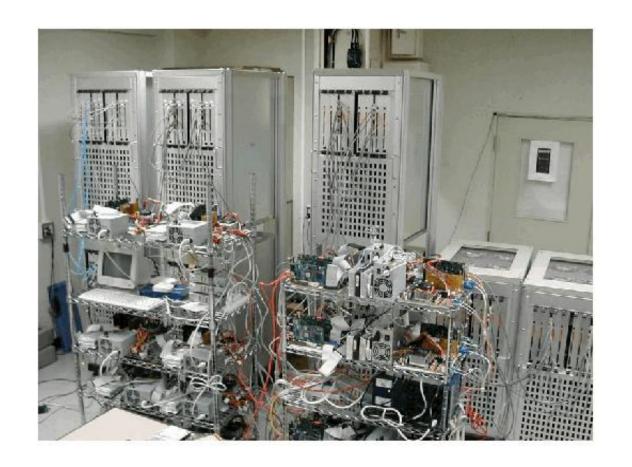
 ϵ = softening parameter eliminates binary stars with r < ϵ hard binaries can be important source of energy

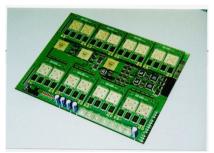
- 3. Evolve particles using ODE solver.
- Leapfrog method balances efficiency and accuracy.
- Truncation error = $O(dt^2)$.
- Symplectic.
- 4. Display and analyze results.

$$\frac{d\mathbf{X_i}}{dt} = \mathbf{V_i}$$
$$m_i \frac{d\mathbf{V_i}}{dt} = \mathbf{F_i}$$

Solving the force problem with hardware.

GRAPE-6. Special purpose hardware to compute force.

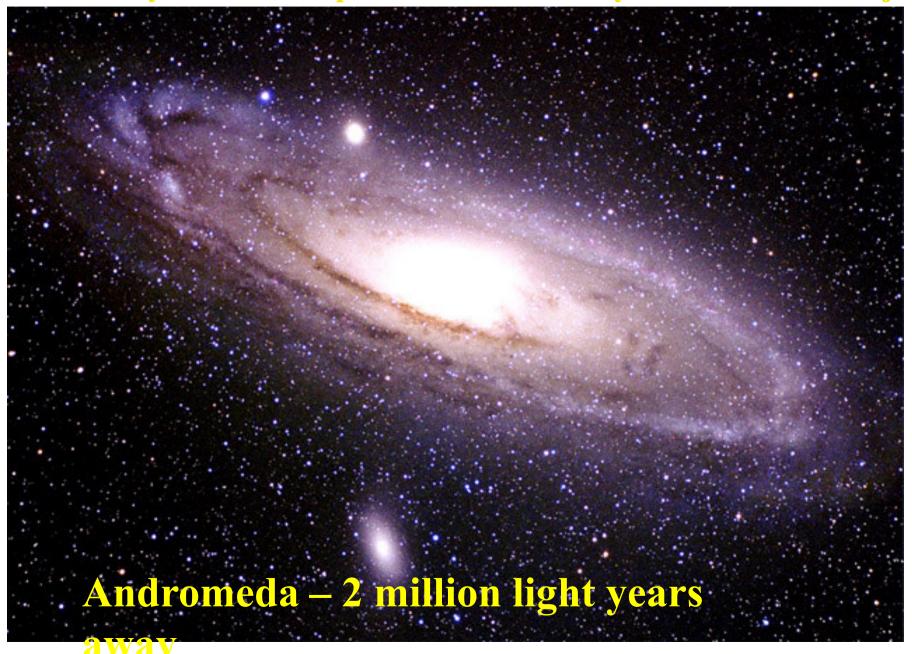




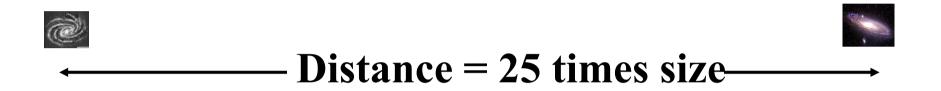
Jun Makino, U. Tokyo

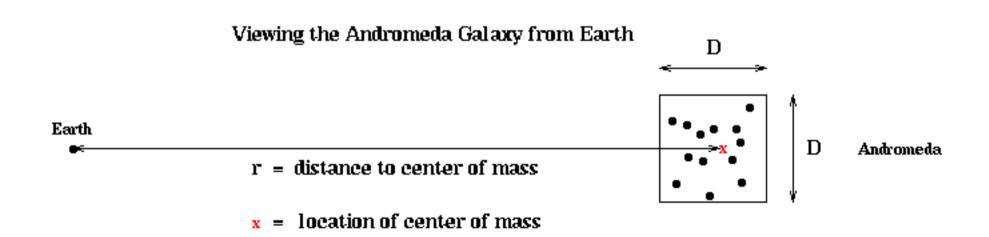


Do we really need to compute force from every star for distant objects



Solving the force problem with software – tree codes





Organize particles into a tree. In Barnes-Hut algorithm, use a quadtree in 2D

A Complete Quadtree with 4 Levels

