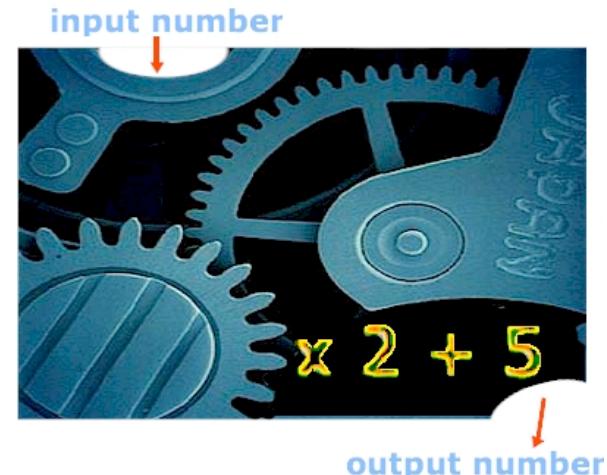
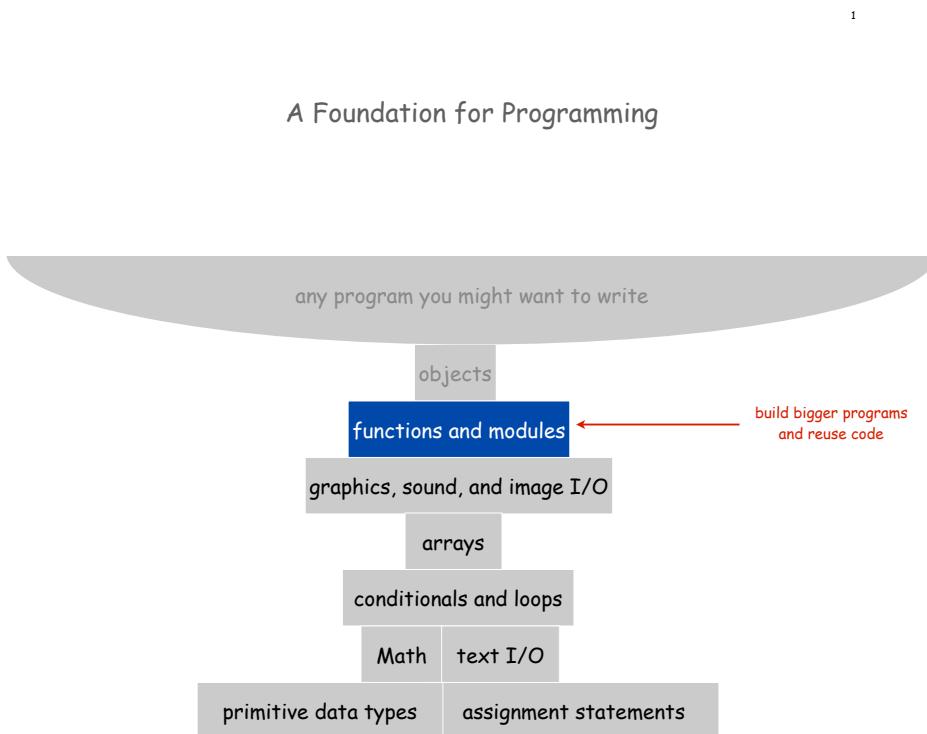
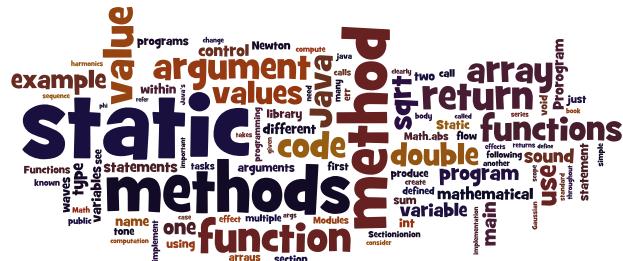


## 2.1 Functions



A Foundation for Programming

## Functions (Static Methods)

## Java function.

- Takes zero or more input arguments.
  - Returns zero or one output value.
  - May cause side effects (e.g., output to standard draw).

more general than mathematical functions

## Applications.

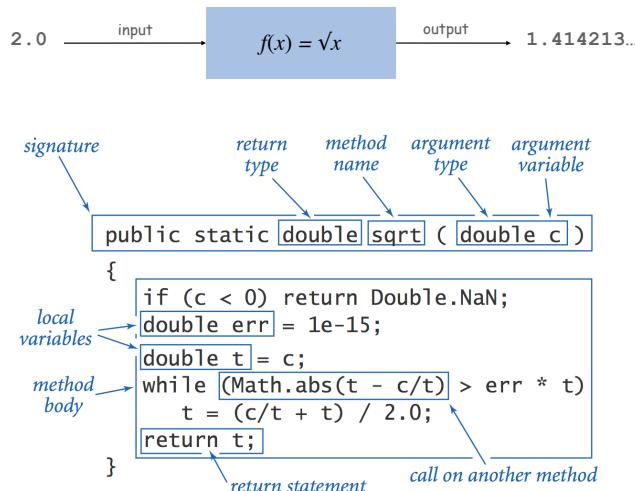
- Scientists use mathematical functions to calculate formulas.
  - Programmers use functions to build modular programs.
  - You use functions for both.

## Examples.

- Built-in functions: `Math.random()`, `Math.abs()`, `Integer.parseInt()`.
  - Our I/O libraries: `StdIn.readInt()`, `StdDraw.line()`, `StdAudio.play()`.
  - User-defined functions: `main()`.

## Anatomy of a Java Function

Java functions. Easy to write your own.



## Flow of Control

**Key point.** Functions provide a **new way** to control the flow of execution.

```

public class Newton
{
    public static double sqrt(double c)
    {
        double epsilon = 1e-15;
        if (c < 0) return Double.NaN;
        double t = c;
        while (Math.abs(t - c/t) > epsilon * t)
            t = (c/t + t) / 2.0;
        return t;
    }

    public static void main(String[] args)
    {
        double[] a = new double[args.length];
        for (int i = 0; i < args.length; i++)
            a[i] = Double.parseDouble(args[i]);
        for (int i = 0; i < a.length; i++)
        {
            double x = sqrt(a[i]);
            StdOut.println(x);
        }
    }
}

```

## Flow of Control

**Key point.** Functions provide a **new way** to control the flow of execution.

Summary of what happens when a function is called:

- Control transfers to the function code.
- Argument variables are assigned the values given in the call.
- Function code is executed.
- Return value is assigned in place of the function name in the calling code.
- Control transfers back to the calling code.

Note. This method (standard in Java) is known as "pass by value".

other languages may use different methods

5

## Scope

**Scope (of a name).** The code that can refer to that name.

**Def.** A variable's scope is code following the declaration in its block.

two different variables  
with the same name i  
each with two lines of scope

```

public class Newton
{
    public static double sqrt(double c)
    {
        double epsilon = 1e-15;
        if (c < 0) return Double.NaN;
        double t = c;
        while (Math.abs(t - c/t) > epsilon * t)
            t = (c/t + t) / 2.0;
        return t;
    }

    public static void main(String[] args)
    {
        double[] a = new double[args.length];
        for (int i = 0; i < args.length; i++)
            a[i] = Double.parseDouble(args[i]);
        for (int i = 0; i < a.length; i++)
            System.out.println(sqrt(a[i]));
    }
}

```

7

**Best practice:** declare variables so as to **limit** their scope.

8

## Function Call Trace

```
public class Newton
{
    public static double sqrt(double c)
    {
        double epsilon = 1e-15;
        if (c < 0) return Double.NaN;
        double t = c;
        while (Math.abs(t - c/t) > epsilon * t)
            t = (c/t + t) / 2.0;
        return t;
    }

    public static void main(String[] args)
    {
        double[] a = new double[args.length];
        for (int i = 0; i < args.length; i++)
            a[i] = Double.parseDouble(args[i]);
        for (int i = 0; i < a.length; i++)
            System.out.println(sqrt(a[i]));
    }
}
```

## TEQ on Functions 1.1

What happens when you compile and run the following code?

```
public class Cubes1
{
    public static int cube(int i)
    {
        int j = i * i * i;
        return j;
    }

    public static void main(String[] args)
    {
        int N = Integer.parseInt(args[0]);
        for (int i = 1; i <= N; i++)
            StdOut.println(i + " " + cube(i));
    }
}
```

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## TEQ on Functions 1.2

What happens when you compile and run the following code?

```
public class Cubes2
{
    public static int cube(int i)
    {
        int i = i * i * i;
        return i;
    }

    public static void main(String[] args)
    {
        int N = Integer.parseInt(args[0]);
        for (int i = 1; i <= N; i++)
            StdOut.println(i + " " + cube(i));
    }
}
```

## TEQ on Functions 1.3

What happens when you compile and run the following code?

```
public class Cubes3
{
    public static int cube(int i)
    {
        i = i * i * i;
        return i;
    }

    public static void main(String[] args)
    {
        int N = Integer.parseInt(args[0]);
        for (int i = 1; i <= N; i++)
            StdOut.println(i + " " + cube(i));
    }
}
```

11

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## TEQ on Functions 1.4

What happens when you compile and run the following code?

```
public class Cubes4
{
    public static int cube(int i)
    {
        i = i * i * i;
        return i;
    }
    public static void main(String[] args)
    {
        int N = Integer.parseInt(args[0]);
        for (int i = 1; i <= N; i++)
            StdOut.println(i + " " + cube(i));
    }
}
```

## TEQ on Functions 1.5

What happens when you compile and run the following code?

```
public class Cubes5
{
    public static int cube(int i)
    {
        return i * i * i;
    }
    public static void main(String[] args)
    {
        int N = Integer.parseInt(args[0]);
        for (int i = 1; i <= N; i++)
            StdOut.println(i + " " + cube(i));
    }
}
```

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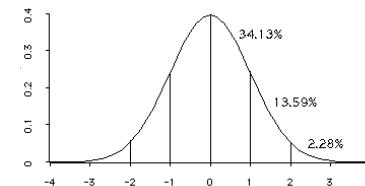
## Example: Gaussian Distribution



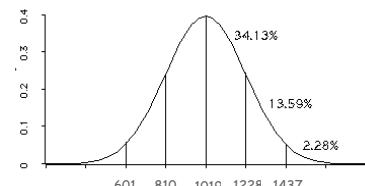
Standard Gaussian distribution.

- "Bell curve."
- Basis of most statistical analysis in social and physical sciences.

Ex. 2000 SAT scores follow a Gaussian distribution with mean  $\mu = 1019$ , stddev  $\sigma = 209$ .



$$\phi(x) = \frac{1}{\sqrt{2\pi}} e^{-x^2/2}$$



$$\begin{aligned} \phi(x, \mu, \sigma) &= \frac{1}{\sigma\sqrt{2\pi}} e^{-(x-\mu)^2/2\sigma^2} \\ &= \phi\left(\frac{x-\mu}{\sigma}\right) / \sigma \end{aligned}$$

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## Java Function for $\phi(x)$

**Mathematical functions.** Use built-in functions when possible; build your own when not available.

```
public class Gaussian
{
    public static double phi(double x)                                 $\phi(x) = \frac{1}{\sqrt{2\pi}} e^{-x^2/2}$ 
    {
        return Math.exp(-x*x / 2) / Math.sqrt(2 * Math.PI);
    }

    public static double phi(double x, double mu, double sigma)
    {
        return phi((x - mu) / sigma) / sigma;
    }
}
```

$$\phi(x, \mu, \sigma) = \phi\left(\frac{x-\mu}{\sigma}\right) / \sigma$$

**Overloading.** Functions with different signatures are different.

**Multiple arguments.** Functions can take any number of arguments.

**Calling other functions.** Functions can call other functions.

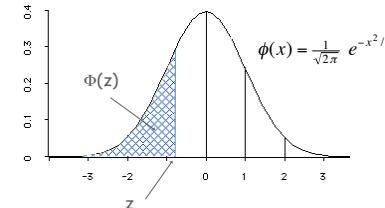
library or  
user-defined

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## Gaussian Cumulative Distribution Function

**Goal.** Compute Gaussian cdf  $\Phi(z)$ .

**Challenge.** No "closed form" expression and not in Java library.



$$\begin{aligned} \Phi(z) &= \int_{-\infty}^z \phi(x) dx && \text{Taylor series} \\ &= \frac{1}{2} + \phi(z) \left( z + \frac{z^3}{3} + \frac{z^5}{3 \cdot 5} + \frac{z^7}{3 \cdot 5 \cdot 7} + \dots \right) \end{aligned}$$

**Bottom line.** 1,000 years of mathematical formulas at your fingertips.

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## Java function for $\Phi(z)$

```
public class Gaussian
{
    public static double phi(double x)
    // as before

    public static double Phi(double z)
    {
        if (z < -8.0) return 0.0;
        if (z > 8.0) return 1.0;
        double sum = 0.0, term = z;
        for (int i = 3; sum + term != sum; i += 2) {
            sum = sum + term;
            term = term * z * z / i;
        }
        return 0.5 + sum * phi(z);           accurate with absolute error
                                            less than  $8 \times 10^{-16}$ 
    }

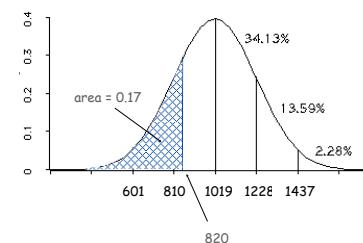
    public static double Phi(double z, double mu, double sigma)
    {
        return Phi((z - mu) / sigma);
    }
}
```

$$\Phi(z, \mu, \sigma) = \int_{-\infty}^z \phi(z, \mu, \sigma) = \Phi((z-\mu) / \sigma)$$

## SAT Scores

**Q.** NCAA requires at least 820 for Division I athletes.  
What fraction of test takers in 2000 do not qualify?

**A.**  $\Phi(820, \mu, \sigma) \approx 0.17051$ . [approximately 17%]



`double fraction = Gaussian.Phi(820, 1019, 209);`

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## Gaussian Distribution

Q. Why relevant in mathematics?

A. Central limit theorem: under very general conditions, average of a set of variables tends to the Gaussian distribution.

Q. Why relevant in the sciences?

A. Models a wide range of natural phenomena and random processes.

- Weights of humans, heights of trees in a forest.
- SAT scores, investment returns.

Caveat.

Everybody believes in the exponential law of errors: the experimenters, because they think it can be proved by mathematics; and the mathematicians, because they believe it has been established by observation. - M. Lippman in a letter to H. Poincaré

## Building Functions

Functions enable you to build a new layer of abstraction.

- Takes you beyond pre-packaged libraries.
- You build the tools you need: `Gaussian.phi()`, ...

Process.

- Step 1: identify a useful feature.
- Step 2: implement it.
- Step 3: use it.
- Step 3': re-use it in **any** of your programs.

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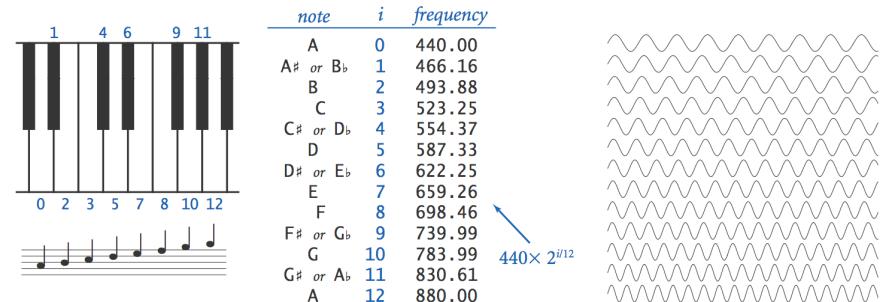
## Crash Course in Sound

Sound. Perception of the **vibration** of molecules in our eardrums.

Concert A. Sine wave, scaled to oscillated at 440Hz.

Other notes. 12 notes on chromatic scale, divided logarithmically.

## Digital Audio

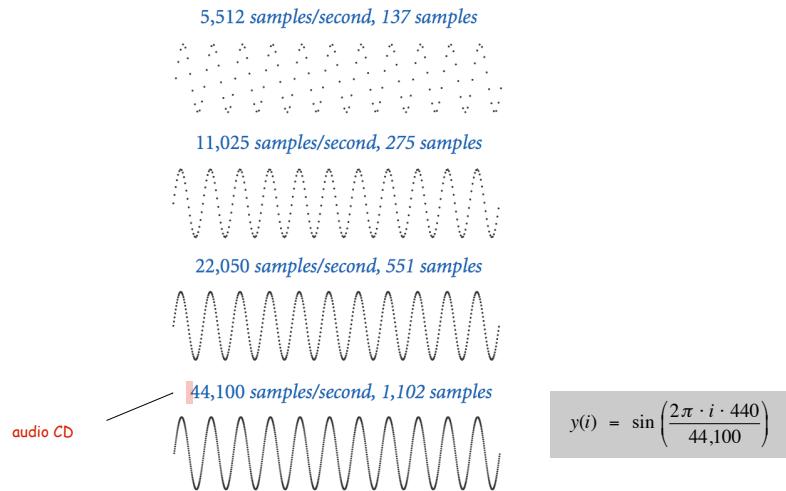


Notes, numbers, and waves

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## Digital Audio

**Sampling.** Represent curve by sampling it at regular intervals.



$$y(i) = \sin\left(\frac{2\pi \cdot i \cdot hz}{44,100}\right)$$

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## Musical Tone Function

**Musical tone.** Create a music tone of a given frequency and duration.

```
public static double[] tone(double hz, double seconds)
{
    int SAMPLE_RATE = 44100;
    int N = (int) (seconds * SAMPLE_RATE);
    double[] a = new double[N+1];
    for (int i = 0; i <= N; i++)
        a[i] = Math.sin(2 * Math.PI * i * hz / SAMPLE_RATE);
    return a;
}
```

$$y(i) = \sin\left(\frac{2\pi \cdot i \cdot hz}{44,100}\right)$$

**Remark.** Can use arrays as function return value and/or argument.

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## Digital Audio in Java

**Standard audio.** Library for playing digital audio.

```
public class StdAudio
    void play(String file)           play the given .wav file
    void play(double[] a)            play the given sound wave
    void play(double x)              play sample for 1/44100 second
    void save(String file, double[] a) save to a .wav file
    double[] read(String file)       read from a .wav file
```

**Concert A.** Play concert A for 1.5 seconds using `StdAudio`.

```
double[] a = tone(440, 1.5);
StdAudio.play(a);
```



library developed  
for this course  
(also broadly useful)



## Warmup: Musical Tone

**Musical tone.** Create a music tone of a given frequency and duration.

```
public class Tone
{
    public static void main(String[] args)
    {
        int sps = 44100;
        double hz      = Double.parseDouble(args[0]);
        double duration = Double.parseDouble(args[1]);
        int N = (int) (sps * duration);
        double[] a = new double[N+1];
        for (int i = 0; i <= N; i++)
            a[i] = Math.sin(2 * Math.PI * i * hz / sps);
        StdAudio.play(a);
    }
}
```

$$y(i) = \sin\left(\frac{2\pi \cdot i \cdot hz}{44,100}\right)$$

```
% java Tone 440 1.5
[ concert A for 1.5 seconds]
```



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## Play That Tune

## TEQ on Functions 2

Goal. Play pitches and durations from standard input on standard audio.

```
public class PlayThatTune
{
    public static void main(String[] args)
    {
        int sps = 44100;
        while (!StdIn.isEmpty())
        {
            int pitch = StdIn.readInt();
            double duration = StdIn.readDouble();
            double hz = 440 * Math.pow(2, pitch / 12.0);
            int N = (int) (sps * duration);
            double[] a = new double[N+1];
            for (int i = 0; i <= N; i++)
                a[i] = Math.sin(2 * Math.PI * i * hz / sps);
            StdAudio.play(a);
        }
    }
}
```

```
% more elise.txt
7 .125
6 .125
7 .125
6 .125
7 .125
2 .125
5 .125
3 .125
0 .25
...
```

```
% java PlayThatTune < elise.txt
```

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What sound does the following program produce?

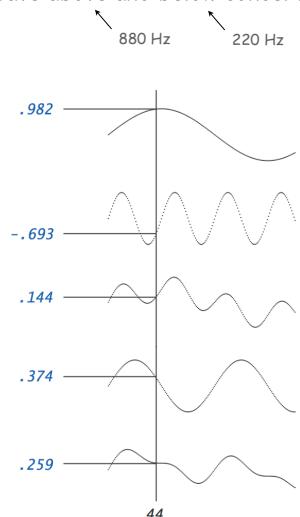
```
public static double[] tone(double hz, double seconds)
{
    int SAMPLE_RATE = 44100;
    int N = (int) (seconds * SAMPLE_RATE);
    double[] a = new double[N+1];
    for (int i = 0; i <= N; i++)
        a[i] = Math.Random();
    return a;
}
```

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## Harmonics

**Concert A with harmonics.** Obtain richer sound by adding tones

one octave above and below concert A.



```
lo = tone(220, .0041);
lo[44] = .982

hi = tone(880, .0041);
hi[44] = -.693

h = sum(hi, lo, .5, .5);
h[44] = .5*lo[44]+.5*hi[44];
= .5*.982 - .5*.693 = .144

A = tone(440, .0041);
A[44] = .374

sum(A, h, .5, .5);
A[44] + h[44] = .5*.374 + .5*.144
= .259
```

## Harmonics

```
public class PlayThatTune
{
    // Return weighted sum of two arrays.
    public static double[] sum(double[] a, double[] b, double awt, double bwt) {
        double[] c = new double[a.length];
        for (int i = 0; i < a.length; i++)
            c[i] = a[i]*awt + b[i]*bwt;
        return c;
    }

    // Return a note of given pitch and duration.
    public static double[] note(int pitch, double duration) {
        double hz = 440.0 * Math.pow(2, pitch / 12.0);
        double[] a = tone(1.0 * hz, duration);
        double[] hi = tone(2.0 * hz, duration);
        double[] lo = tone(0.5 * hz, duration);
        double[] h = sum(hi, lo, .5, .5);
        return sum(a, h, .5, .5);
    }

    public static double[] tone(double hz, double t)
        // see previous slide

    public static void main(String[] args)
        // see next slide
    }
}
```

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## Harmonics

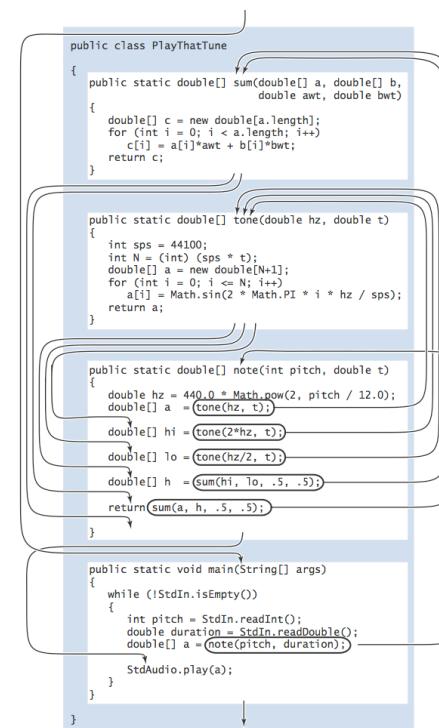
**Play that tune.** Read in pitches and durations from standard input, and play using standard audio.

```
public static void main(String[] args)
{
    while (!StdIn.isEmpty())
    {
        int pitch = StdIn.readInt();
        double duration = StdIn.readDouble();
        double[] a = note(pitch, duration);
        StdAudio.play(a);
    }
}
```

```
% more elise.txt      % java PlayThatTune < elise.txt
7 .125
6 .125
7 .125
6 .125
7 .125
2 .125
5 .125
3 .125
0 .25
```



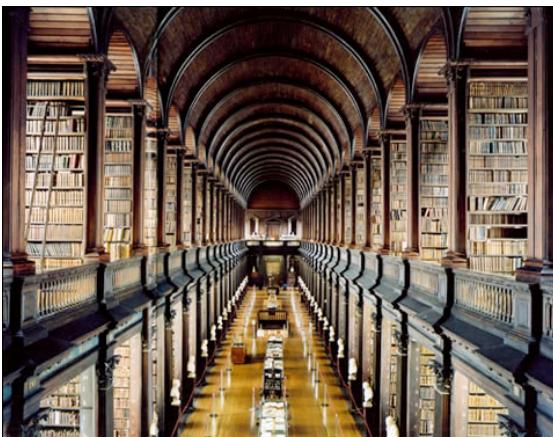
33



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## Libraries

### 2.2 Libraries and Clients

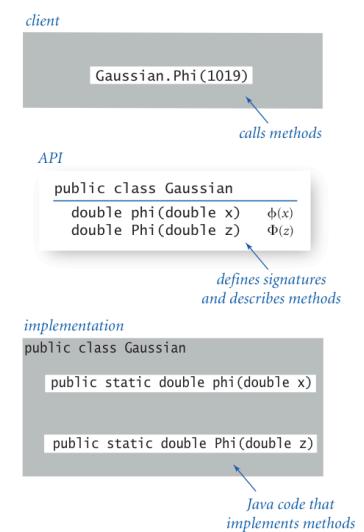


**Library.** A module whose methods are primarily intended for use by many other programs.

**Client.** Program that calls a library.

**API.** Contract between client and implementation.

**Implementation.** Program that implements the methods in an API.



## Standard Random

**Standard random.** Our library to generate pseudo-random numbers.

```
public class StdRandom
    int uniform(int N)           integer between 0 and N-1
    double uniform(double lo, double hi) real between lo and hi
    boolean bernoulli(double p)   true with probability p
    double gaussian()           normal, mean 0, standard deviation 1
    double gaussian(double m, double s) normal, mean m, standard deviation s
    int discrete(double[] a)     i with probability a[i]
    void shuffle(double[] a)     randomly shuffle the array a[]
```

```
int getRandomNumber()
{
    return 4; // chosen by fair dice roll.
              // guaranteed to be random.
}
```

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## Standard Random

```
public class StdRandom
{
    // between a and b
    public static double uniform(double a, double b)
    {
        return a + Math.random() * (b-a);
    }

    // between 0 and N-1
    public static int uniform(int N)
    {
        return (int) (Math.random() * N);
    }

    // true with probability p
    public static boolean bernoulli(double p)
    {
        return Math.random() < p;
    }

    // gaussian with mean = 0, stddev = 1
    public static double gaussian()
    /* see Exercise 1.2.27 */

    // gaussian with given mean and stddev
    public static double gaussian(double mean, double stddev)
    {
        return mean + (stddev * gaussian());
    }

    ...
}
```

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## Unit Testing

**Unit test.** Include `main()` to test each library.

```
public class StdRandom
{
    ...
    public static void main(String[] args)
    {
        int N = Integer.parseInt(args[0]);
        for (int i = 0; i < N; i++) {
            StdOut.printf("%2d ", uniform(100));
            StdOut.printf("%8.5f ", uniform(10.0, 99.0));
            StdOut.printf("%5b ", bernoulli(.5));
            StdOut.printf("%7.5f ", gaussian(9.0, .2));
            StdOut.println();
        }
    }
}
```

```
% java StdRandom 5
61 21.76541  true 9.30910
57 43.64327 false 9.42369
31 30.86201  true 9.06366
92 39.59314  true 9.00896
36 28.27256 false 8.66800
```

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## Using a Library

```
public class RandomPoints
{
    public static void main(String args[])
    {
        int N = Integer.parseInt(args[0]);
        for (int i = 0; i < N; i++)
        {
            double x = StdRandom.gaussian(0.5, 0.2);
            double y = StdRandom.gaussian(0.5, 0.2);
            StdDraw.point(x, y);
        }
    }
}
```

use library name  
to invoke method

```
% javac RandomPoints.java
% java RandomPoints 10000
```

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## Standard Statistics

**Ex.** Library to compute statistics on an array of real numbers.

```
public class StdStats
{
    double max(double[] a)          largest value
    double min(double[] a)          smallest value
    double mean(double[] a)         average
    double var(double[] a)          sample variance
    double stddev(double[] a)        sample standard deviation
    double median(double[] a)       median
    void plotPoints(double[] a)      plot points at (i, a[i])
    void plotLines(double[] a)       plot lines connecting points at (i, a[i])
    void plotBars(double[] a)        plot bars to points at (i, a[i])
}
```

$$\mu = \frac{a_0 + a_1 + \dots + a_{n-1}}{n}, \quad \sigma^2 = \frac{(a_0 - \mu)^2 + (a_1 - \mu)^2 + \dots + (a_{n-1} - \mu)^2}{n-1}$$

*mean* *sample variance*

## Standard Statistics

**Ex.** Library to compute statistics on an array of real numbers.

```
public class StdStats
{
    public static double max(double[] a)
    {
        double max = Double.NEGATIVE_INFINITY;
        for (int i = 0; i < a.length; i++)
            if (a[i] > max) max = a[i];
        return max;
    }

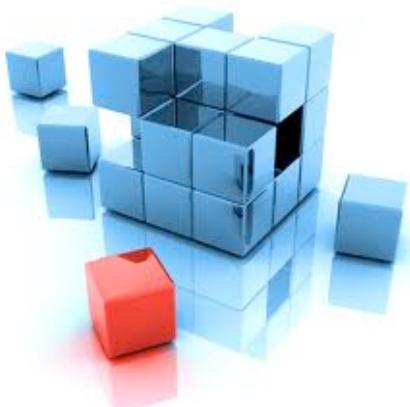
    public static double mean(double[] a)
    {
        double sum = 0.0;
        for (int i = 0; i < a.length; i++)
            sum = sum + a[i];
        return sum / a.length;
    }

    public static double stddev(double[] a)
        // see text
    }
}
```

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## Modular Programming



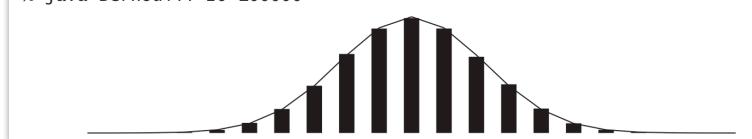
### Modular programming.

- Divide program into self-contained pieces.
- Test each piece individually.
- Combine pieces to make program.

**Ex.** Flip N coins. How many heads?

- Read arguments from user.
- Flip one fair coin.
- Flip N fair coins and count number of heads.
- Repeat simulation, counting number of times each outcome occurs.
- Plot histogram of empirical results.
- Compare with theoretical predictions.

% java Bernoulli 20 100000



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## Bernoulli Trials

```

public class Bernoulli
{
    public static int binomial(int N)
    {
        int heads = 0;
        for (int j = 0; j < N; j++)
            if (StdRandom.bernoulli(0.5)) heads++;
        return heads;
    }

    public static void main(String[] args)
    {
        int N = Integer.parseInt(args[0]);           flip N fair coins;
                                                return # heads
        int T = Integer.parseInt(args[1]);           perform T trials
                                                    of N coin flips each

        int[] freq = new int[N+1];
        for (int i = 0; i < T; i++)
            freq[binomial(N)]++;

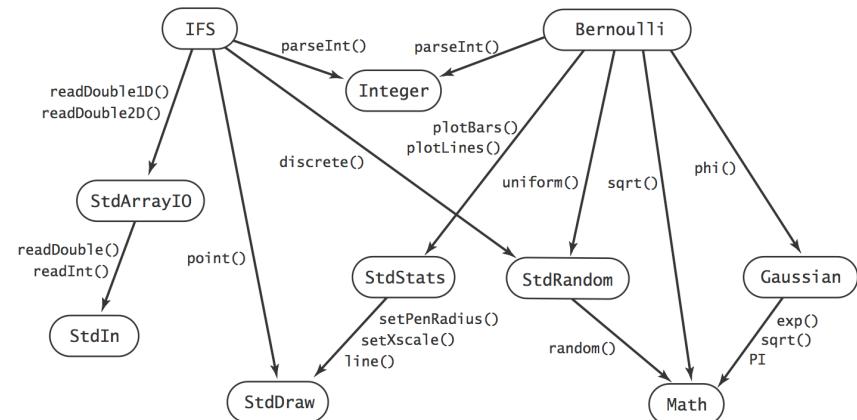
        double[] normalized = new double[N+1];
        for (int i = 0; i <= N; i++)
            normalized[i] = (double) freq[i] / T;
        StdStats.plotBars(normalized);

        double mean = N / 2.0, stddev = Math.sqrt(N) / 2.0;   theoretical
        double[] phi = new double[N+1];                         prediction
        for (int i = 0; i <= N; i++)
            phi[i] = Gaussian.phi(i, mean, stddev);
        StdStats.plotLines(phi);
    }
}

```

## Dependency Graph

**Modular programming.** Build relatively complicated program by combining several small, independent, modules.



## Libraries

### Why use libraries?

- Makes code easier to understand.
- Makes code easier to debug.
- Makes code easier to maintain and improve.
- Makes code easier to reuse.