# Introduction to Julia Programming Language 

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TEXAS A\&M UNIVERSITY
E
School of Performance, Visualization \& Fine Arts

High Performance
A Research Computing division of research
texas AzM
A Institute of
Data Science

## Introduction to Julia

Part I. Getting Started with


Part V. Plotting with Julia (~10 mins)

Part IV. Basics of Julia ( $\sim 60 \mathrm{mins}$ )

Part III. Julia as an Advanced Calculator (~30 mins)

## Part I. Getting Started with ACES



TAMU HPRC Short Course: Getting Started with FASTER and ACES

## Common HPC System



Programming Models: MPI + (CUDA, OpenCL, OpenMP, OpenACC, etc.)

## NSF ACES

## Accelerating Computing for Emerging Sciences

Our Mission:

- NSF ACSS CI test-bed
- Offer an accelerator testbed for numerical simulations and $\mathrm{Al} / \mathrm{ML}$ workloads
- Provide consulting, technical guidance, and training to researchers
- Collaborate on computational and data-enabled research.


## ACES In Action



RIM High Performance Research Computing | hprc.tamu.edu | NSF Award \#2112356

## ACES System Description

## Component <br> Description

Dual Intel Sapphire Rapids 2.1 GHz
CPU-centric computing with variable memory requirements

Composable infrastructure

Data transfer nodes
1.6 TB NVMe storage (PCle 5.0), NVIDIA Mellanox NDR 200 Gbps InfiniBand

Reconfigurable infrastructure that allows up to 20 PCle cards (GPU, FPGA, VE, etc.) per compute node

100 Gbps network adapter

## ACES Accelerators

| Component | Quantity | Description |
| :--- | :---: | :--- |
| Graphcore IPU | 32 | 16 Colossus GC200 IPUs; 16 Bow IPUs. Each IPU group hosted with a CPU <br> server as a POD16 on a 100 GbE RoCE fabric |
| Intel PAC D5005 FPGA | 2 | Accelerator with Intel Stratix 10 GX FPGA and 32 GB DDR4 |$|$| AittWare IA-840F FPGA |
| :--- |

$\operatorname{AlN}$ High Performance Research Computing | hprc.tamu.edu | NSF Award \#2112356

## Research Workflows - Accelerators

## Hardware Proflle

## Applications Supported

- AI/ML (Statistical Machine Learning, Data Frame)
NEC Vector Engines

Graphcore IPUs

Intel/Bittware FPGA

Intel Optane SSDs

NextSilicon

- Chemistry (VASP, Quantum ESPRESSO)
- Earth Sciences
- NumPy Acceleration
- Graph Data
- LSTM Neural Networks
- Al Models for Embedded Use Cases
- Big Data
- CXL Memory Interface
- Deep Learning Inference
- Genomics
- Bioinformatics
- Computational Fluid Dynamics (OpenFOAM)
- Biosciences (BLAST)
- Computational Fluid Dynamics (OpenFOAM)
- Cosmology (HACC)
- Graph Search (Pathfinder)
- Oil \& Gas (Seismic Imaging, Reservoir Simulation)
- Plasma Simulation
- Weather/Climate Simulation
- Markov Chain Monte Carlo
- Natural Language Processing (Deep Learning)
- MD Codes
- Microcontroller Emulation for Autonomy Simulations
- Streaming Data Analysis
- MD Codes
- R
- WRF
- Molecular Dynamics (NAMD, AMBER, LAMMPS)
- Quantum ChromoDynamics (MILC)
- Weather/Environment modeling (WRF)


## ACES Configuration - Feb 2024



## Getting on ACES

- You must have an ACCESS account!
- Application for ACES is available through ACCESS:
https://allocations.access-ci.org
- Email us at help@hprc.tamu.edu for questions, comments, and concerns.



## Batch Computing on Clusters

Workflow on a cluster:

- Interact via your own machine
- Log in to the cluster's portal (and/or the login nodes) and write instructions
- Send instructions to compute nodes to do the heavy-lifting



## Accessing the HPRC Portal

- HPRC webpage: hprc.tamu.edu, Portal dropdown menu



## Accessing ACES via the HPRC Portal (ACCESS)

Log-in using your ACCESS credentials.


Powored By Cllogon
Consent to Atribute Release
TAMU FASTER ACC ESS OOD requests access to the following informaion. fi you do not approve this request, do not proceed

- Your CLLogon user identifier
- Your name
- Your email address

Your usemane and atfiliation from your identity provider

aACCESS
Login to CILogon
access username
ACCESS Password
$\square$ Don't Remember togin
Dont Remember Login
(1) Cllogon
criogon faciitetes secure access to cyberInriastructure (CI)
a If you had an XSEDE account, ple PRegister for an ACCESS Actount
$\rightarrow$ Forgot your password?
, Need Help?

Select the Identity
Provider appropriate for your account.

## Shell Access via the Portal



## ACES Shell Access - Shell



## Using Pre-installed Julia Module

Step 1. Find the module to be loaded
\$ module spider julia
...
Description:
Julia is a high-level, high-performance dynamic programming language for numerical computing

Versions:
Julia/1.8.5-linux-x86_64
Julia/1.9.3-linux-x86_64
Julia/1.10.0-musl-x86_64
Julia/1.10.2-linux-x86_64

You can also use the web-based interface to find software modules available on HPRC systems.


## Using Your Own Julia Installation

| Step 1. Find the version to be installed at Download Julia |  |  |
| :---: | :---: | :---: |
| - | $\cdots$ | "- |
| $=$ | $\cdots$ |  |
| 5 | $\cdots$ | $\ldots$ |
| - | -2mem |  |
|  |  |  |
| \$curl-fsSL https://install julialang org \| sh |  |  |

## Step 2. Download \& Unzip

\$ cd \$SCRATCH
\$ wget https://.../julia-1.10.2-linux-x86_64.tar.gz
\$ tar -zxvf julia-1.10.2-linux-x86_64.tar.gz

## Step 3. Start Julia REPL

\$ module purge
\$ cd \$SCRATCH/julia-1.10.2/bin; ./julia


## Install Julia Packages

\# export Julia Depot path (default to ~/.julia) \$export JULIA_DEPOT_PATH=\$SCRATCH/.julia
\# start Julia
\$julia
\# type ']' to open Pkg REPL
\# press backspace or ${ }^{\wedge}$ C to quit Pkg REPL. julia>]
(@v1.9) pkg> add Plots UnicodePlots Plotly

## Commands to Copy Examples

- Navigate to your personal scratch directory
\$ cd \$SCRATCH
- Files for this course are located at
/scratch/training/julia_examples.tgz
Make a copy in your personal scratch directory
\$ cp /scratch/training/julia/julia_examples.tgz \$SCRATCH/
- Extract the files

```
$ tar -zxvf julia_examples.tgz
```

- Enter this directory (your local copy)
\$cd julia_examples
\$ julia helloworld.jl


## Load Julia Module, Compile, and Run

```
[u.jt1630@aces-login1 julia_examples]$ module load Julia/1.10.2-linux-x86_64
[u.jt1630@aces-login1 julia_examples]$ ml
Currently Loaded Modules:
    1) Julia/1.10.2-linux-x86_64
[u.jt1630@aces-login1 julia_examples]$ julia helloworld.jl
hello world!
[u.jt1630@aces-login1 julia_examples]$ julia
\begin{tabular}{l|l|l}
\((-)\) & Documentation: https://docs.julialang.org \\
\hline
\end{tabular}
julia> versioninfo()
Julia Version 1.10.2
Commit bd47eca2c8a (2024-03-01 10:14 UTC)
Build Info:
    Official https://julialang.org/ release
Platform Info:
    OS: Linux (x86 64-linux-gnu)
    CPU: 96 x Intel(R) Xeon(R) Platinum }846
    WORD SIZE: }6
    LIBM: libopenlibm
    LLVM: libLLVM-15.0.7 (ORCJIT, sapphirerapids)
Threads: 1 default, 0 interactive, 1 GC (on 96 virtual cores)
Environment:
    LD LIBRARY_PATH = /sw/eb/sw/Julia/1.10.2-linux-x86_64/lib
    JULIA DEPOT} PATH =
julia>
```


## Julia - Quickstart

The julia program starts the interactive REPL. You will be immediately switched to the shell mode if you type a semicolon. A question mark will switch you to the help mode. The <TAB> key can help with autocompletion.

```
julia> versioninfo()
julia> VERSION
```

Special symbols can be typed with the escape symbol and <TAB>, but they might not show properly on the web-based terminal.

```
julia> \sqrt <TAB>
julia> for i G 1:10 println(i) end #\in <TAB>
```


## Julia REPL Keybindings

| Keybinding | Descrition |
| :--- | :--- |
| $\wedge \mathrm{d}$ | Exit (when buffer is empty) |
| $\wedge_{\mathrm{c}}$ | Interrupt or cancel |
| $\wedge \mathrm{l}$ | Clear console screen |
| Return/Enter, $\wedge \mathrm{J}$ | New line, executing if it is complete |
| $?$ or $;$ | Enter help or shell mode (when at start of a line) |
| $\wedge \mathrm{R}, \wedge \mathrm{S}$ | Incremental history search |
| J | Enter Pkg REPL |
| Backspace or $\wedge \mathrm{c}$ | Quit Pkg REPL |

## Part II. Julia - What and Why?

Julia is a high-level general-purpose dynamic programming language primarily designed for high-performance numerical analysis and computational science.

- Born in MIT's Computer Science and Artificial Intelligence Lab in 2009
- Combined the best features of Ruby, MatLab, C, Python, R, and others
- First release in 2012
- Latest stable release v1.10.2 as of Mar 31, 2024
- https://julialang.org/
- customized for "greedy, unreasonable, demanding programmers".
- Julia Computing established in 2015 to provide commercial support.


Image Credit: Julia Micro-Benchmarks

RedMonk Q124 Programming Language Rankings


Image Credit: RedMonk (The RedMonk Programming Language Rankings: January 2024 - tecosystems)

## julliá

## Major features of Julia:

- Fast: designed for high performance,
- General: supporting different programming patterns,
- Dynamic: dynamically-typed with good support for interactive use,
- Technical: efficient numerical computing with a math-friendly syntax,
- Optionally typed: a rich language of descriptive data types,
- Composable: Julia's packages naturally work well together.

Mostly importantly, for many of us, Julia seems to be the language of choice for Scientific Machine Learning.
"Julia is as programmable as Python while it is as fast as Fortran for number crunching. It is like Python on steroids."
--an anonymous Julia user on the first impression of Julia.

## Juno IDE

- Juno is an Integrated Development Environment (IDE) for the Julia language.
- Juno is built on Atom, a text editor provided by Github.



## Jupyter Notebook



Image Credit: Jupyter (http://jupyter.org/)

## Julia REPL

```
[u.jt1630@aces-login2 ~]$ julia
```



- Julia comes with a full-featured interactive command-line REPL (read-eval-print loop) built into the Julia executable.
- In addition to allowing quick and easy evaluation of Julia statements, it has a searchable history, tab-completion, many helpful keybindings, and dedicated help and shell modes.


## Part III. Julia as an Advanced Calculator



Image Credit: http://www.ti.com/

## Arithmetic Operators

| + | Addition (also unary plus) |
| :--- | :--- |
| - | Subtraction (also unary minus) |
| * | multiplication |
| $/$ | division |
| \} $&{\text { inverse division }} \\ {\%} &{\text { mod }} \\ {\wedge} &{\text { to the power of }}$ |  |

## More about Arithmetic Operators

1. The order of operations follows the math rules.
2. The updating version of the operators is formed by placing a " $=$ " immediately after the operator. For instance, $\mathbf{x + = 3}$ is equivalent to $\mathbf{x}=\mathbf{x + 3}$.
3. Unicode could be defined as operator.
4. A "dot" operation is automatically defined to perform the operation element-by-element on arrays in every binary operation.
5. Numeric Literal Coefficients: Julia allows variables to be immediately preceded by a numeric literal, implying multiplication.

## Arithmetic Expressions

Some examples:

$$
\begin{aligned}
& \text { julia> } 10 / 5^{*} 2 \\
& \text { julia> } 5^{*} 2^{\wedge} 3+4 \backslash 2 \\
& \text { julia> } 2^{\wedge} 4 \\
& \text { julia> } 8^{\wedge 1 / 3} \\
& \text { julia> pi* \#\euler <TAB> } \\
& \text { julia> x=1; x+=3.1 } \\
& \text { julia> x=[1,2]; x = x.^(-2) }
\end{aligned}
$$

## Relational Operators



* try $\neq(4,5)$, what does this mean? How about $!=(4,5)$


## Boolean and Bitwise Operators

$\& \&$
$|\mid$
$!$
xor ()
$\mid$
$\sim$
$\&$
$\gg$
$\ll$

Logical and
Logical or
Not
Exclusive OR
Bitwise OR
Negate
Bitwise And
Right shift
Left shift

## NaN and Inf

NaN is a not-a-number value of type Float64.
Inf is positive infinity of type Float64.
-Inf is negative infinity of type Float64.

- Inf is equal to itself and greater than everything else except $\mathbf{N a N}$.
- -Inf is equal to itself and less then everything else except $\mathbf{N a N}$.
- $\quad \mathbf{N a N}$ is not equal to, not less than, and not greater than anything, including itself.

```
julia> NaN == NaN #false
julia> NaN != NaN
true
julia> NaN < NaN
false
julia> NaN > NaN
false
julia> isequal(NaN, NaN)
true
julia> isnan(1/0)
false
```


## Variables

The basic types of Julia include float, int, char, string, and bool. A global variable can not be deleted, but its content could be cleared with the keyword nothing. Unicode can be used as variable names!

```
julia> b = true; typeof(b)
julia> varinfo()
julia> x = "Hi"; x > "He" # x='Hi' is wrong. why?
julia> y = 10
julia> z = complex(1, y)
julia> println(b, x, y, z)
julia> b = nothing; show(b)
julia> #=2; 弯=1 # \:football: <TAB> \:runner: <TAB>
```


## Naming Rules for Variables

Variable names must begin with a letter or underscore

$$
\text { julia> 4c = } 12
$$

Names can include any combinations of letters, numbers, underscores, and exclamation symbol. Some unicode characters could be used as well

$$
\text { julia> c_4 = 12; } \delta=2
$$

Maximum length for a variable name is not limited Julia is case sensitive. The variable name $\mathbf{A}$ is different than the variable name $\mathbf{a}$.

## Displaying Variables

We can display a variable (i.e., show its value) by simply typing the name of the variable at the command prompt (leaving off the semicolon).

We can also use print or println (print plus a new line) to display variables.
julia> print("The value of $x$ is:"); print(x)
julia> println("The value of $x$ is:"); print(x)

## Exercise

Create two variables: $\mathbf{a}=4$ and $\mathbf{b}=17.2$

Now use Julia to perform the following set of calculations:

$$
\begin{array}{lc}
(b+5.4)^{1 / 3} & b^{2}-4 b+5 a \\
a>b \& \& a>1.0 & a!=b
\end{array}
$$

## Basic Syntax for Statements (I)

1. Comments start with '\#'
2. Compound expressions with begin blocks and (; ) chains

$$
\begin{gathered}
\text { julia> } z=\text { begin } \\
x=1 \\
y=2 \\
\\
x+y
\end{gathered}
$$

## Basic Syntax for Statements (II)

The statements could be freely arranged with an optional '; ' if a new line is used to separate statements.

$$
\begin{aligned}
& \text { julia> begin } x=1 ; y=2 ; x+y \text { end } \\
& \text { julia> }(x=1 ; \\
& \quad y=2 ; \\
& x+y)
\end{aligned}
$$

## Numerical Data Types



## Integer Data Types

| Type | Signed? | Number of bits | Smallest value | Largest value |
| :--- | :--- | :--- | :--- | :--- |
| Int8 | $\checkmark$ | 8 | $-2^{\wedge} 7$ | $2^{\wedge} 7-1$ |
| UInt8 |  | 8 | 0 | $2^{\wedge} 8-1$ |
| Int16 | $\checkmark$ | 16 | $-2^{\wedge} 15$ | $2^{\wedge} 15-1$ |
| UInt16 |  | 16 | 0 | $2^{\wedge} 16-1$ |
| Int32 | $\checkmark$ | 32 | $-2^{\wedge} 31$ | $2^{\wedge} 31-1$ |
| UInt32 |  | 32 | 0 | $2^{\wedge} 32-1$ |
| Int64 | $\checkmark$ | 64 | $-2^{\wedge} 63$ | $2^{\wedge} 63-1$ |
| UInt64 |  | 64 | 0 | $2^{\wedge} 64-1$ |
| Int128 | $\checkmark$ | 128 | $-2^{\wedge} 127$ | $2^{\wedge} 127-1$ |
| UInt128 |  | 128 | 0 | $2^{\wedge} 128-1$ |
| Bool | N/A | 8 | false (0) | true (1) |

## Handling Big Integers

An overflow happens when a number goes beyond the representable range of a given type. Juliat provides BigInt type to handle big integers.

```
julia> x = typemax(Int64)
julia> x + 1
julia> x + 1 == typemin(Int64)
julia> x = big(typemax(Int64))^100
```


## Floating Point Data Types

| Type | Precision | Number of bits | Range |
| :--- | :--- | :--- | :--- |
| Float16 | half | 16 | -65504 to $-6.1035 \mathrm{e}-05$ <br> $6.1035 \mathrm{e}-05$ to 65504 |
| Float32 | single | 32 | -3.402823 E 38 to $-1.401298 \mathrm{E}-45$ <br> $1.401298 \mathrm{E}-45$ to 3.402823 E 38 |
| Float64 | double | 64 | -1.79769313486232 E 308 to $-4.94065645841247 \mathrm{E}-324$ <br> $4.94065645841247 \mathrm{E}-324$ to 1.79769313486232 E 308 |

- Additionally, full support for Complex and Rational Numbers is built on top of these primitive numeric types.
- All numeric types interoperate naturally without explicit casting thanks to a user-extensible type promotion system.


## Handling Floating-point Types (I)

Perform each of the following calculations in your head.

$$
\begin{aligned}
& \text { julia> } a=4 / 3 \\
& \text { julia> } b=a-1 \\
& \text { julia> } c=3 * b \\
& \text { julia> } e=1-c
\end{aligned}
$$

What does Julia get?

## Handling Floating-point Types (II)

What does Julia get?

$$
\begin{aligned}
& \text { julia> } a=4 / 3 \quad \# 1.3333333333333333 \\
& \text { julia> } b=a-1 \# 0.33333333333333326 \\
& \text { julia> } c=3 * b \quad \# 0.9999999999999998 \\
& \text { julia> } e=1-c \# 2.220446049250313 e-16
\end{aligned}
$$

It is impossible to perfectly represent all real numbers using a finite string of 1 's and 0's.

## Handling Floating-point Types (III)

Now try the following with BigFloat

$$
\begin{aligned}
& \text { julia> } a=b i g(4) / 3 \\
& \text { julia> } b=a-1 \\
& \text { julia> } c=3^{*} b \\
& \text { julia> } e=1-c \#-1.7272337110188 \ldots e-77
\end{aligned}
$$

Next, set the precision and repeat the above
julia> setprecision(4096)

BigFloat variables can store floating point data with arbitrary precision with a performance cost.

## Complex and Rational Numbers

The global constant im is bound to the complex number $\mathbf{i}$, representing the principal square root of $\mathbf{- 1}$.

```
    julia> 2(1 - 1im)
    julia> sqrt(complex(-1, 0))
```

Note that $3 / 4 \mathrm{im}==3 /(4 * i m)==-(3 / 4 * i m)$, since a literal coefficient binds more tightly than division. 3/(4*im)!=(3/4*im)

Julia has a rational number type to represent exact ratios of integers. Rationals are constructed using the // operator, e.g., 9//27

## Some Useful Math Functions

Rounding and division functions

| Function | Descrition |
| :---: | :---: |
| round( x ) | round x to the nearest integer |
| floor(x) | round $x$ towards -lnf |
| ceil(x) | round $x$ towards + Inf |
| trunc( x ) | round $x$ towards zero |
| $\operatorname{div}(x, y)$ | truncated division; quotient rounded towards zero |
| fld ( $\mathrm{x}, \mathrm{y}$ ) | floored division; quotient rounded towards -Inf |
| cld( $\mathrm{x}, \mathrm{y}$ ) | ceiling division; quotient rounded towards + Inf |
| rem(x,y) | remainder; satisfies $x==\operatorname{div}(x, y)^{*} y+\operatorname{rem}(x, y)$; sign matches $x$ |
| $\operatorname{gcd}(\mathrm{x}, \mathrm{y} \ldots$. | greatest positive common divisor of $\mathrm{x}, \mathrm{y}, \ldots$ |
| $\operatorname{lcm}(x, y \ldots)$ | least positive common multiple of $x, y, \ldots$ |

Sign and absolute value functions

| Function | Descrition |
| :--- | :--- |
| $\mathbf{a b s}(\mathbf{x})$ | a positive value with the magnitude of $x$ |
| abs2( $\mathbf{x}$ ) | the squared magnitude of $x$ |
| sign $(\mathbf{x})$ | indicates the sign of $x$, returning $-1,0$, or +1 |
| signbit( $\mathbf{x})$ | indicates whether the sign bit is on (true) or <br> off (false) |
| copysign $(\mathbf{x}, \mathbf{y})$ | a value with the magnitude of $x$ and the sign <br> of $y$ |
| flipsign $(\mathbf{x}, \mathbf{y})$ | a value with the magnitude of $x$ and the sign <br> of $x^{\star} y$ |

* The built-in math functions in Julia are implemented in C(openlibm).


## Chars and Strings

Julia has a first-class type representing a single character, called
Char. Single quotes are \& double quotes are used different in Julia.

$$
\begin{aligned}
& \text { julia> a = 'H' \#a is a character object } \\
& \text { julia> b = "H" \#a is a string with length } 1
\end{aligned}
$$

Strings and Chars can be easily manipulated with built-in functions.

$$
\begin{aligned}
& \text { julia> c = string('s') * string('d') } \\
& \text { julia> length(c); d = c^10*"4"; split(d,"s") }
\end{aligned}
$$

## Handling Strings (I)

1. The built-in type used for strings in Julia is String. This supports the full range of Unicode characters via the UTF-8 encoding.
2. Strings are immutable.
3. A Char value represents a single character.
4. One can do comparisons and a limited amount of arithmetic with Char.
5. All indexing in Julia is 1-based: the first element of any integer-indexed object is found at index 1 .
```
julia> str = "Hello, world!"
julia> c = str[1] #c = 'H'
julia> c = str[end] #c = '!'
julia> c = str[2:8] #c = "ello, w"
```


## Handling Strings (II)

Interpolation: Julia allows interpolation into string literals using \$, as in Perl. To include a literal $\$$ in a string literal, escape it with a backslash:

$$
\begin{aligned}
& \text { julia> "1 + } 2=\$(1+2) " \# " 1+2=3 " \\
& \text { julia> print("\\
$100 dollars! } \mathrm{Xn} ")
\end{aligned}
$$

Triple-Quoted String Literals: no need to escape for special symbols and trailing whitespace is left unaltered.

## Handling Strings (III)

Julia comes with a collection of tools to handle strings.

```
julia> str="Julia"
julia> occursin("lia", str)
julia> z = repeat(str, 10)
julia> firstindex(str)
julia> lastindex(str)
julia> length(str)
```

Julia also supports Perl-compatible regular expressions (regexes). julia> occursin(r"^\s*(?:\#|\$)", "\# a comment")

## Help

- For help on a specific function or macro, type ? followed by its name, and press enter. This only works if you know the name of the function you want help with. With ${ }^{\wedge} \mathbf{S}$ and ${ }^{\wedge} \mathbf{R}$ you can also do historical search.
Julia> ?cos
- Type ?help to get more information about help
Julia> ?help


## Part IV. Basics of Julia

## 1. Functions - Building Blocks of Julia

```
function mandelbrot(a)
    z = 0
    for i=1:50
        z = z^2 + a
    end
    return z
end
for y=1.0:-0.05:-1.0
    for x=-2.0:0.0315:0.5
    abs(mandelbrot(complex(x,y))) < 2 ?
print("*") : print(" ")
    end
    println()
end
```


## Definition of Functions

Two equivalent ways to define a function

$$
\begin{aligned}
& \text { julia> function func }(x, y) \\
& \text { return } x+y, x \\
& \text { end }
\end{aligned}
$$

$$
\text { julia> } \Sigma(x, y)=x+y, x
$$

Operators are functions
julia> +(1,2); plusfunc=+ Julia> plusfunc $(2,3)$

Recommended style for function definition: append ! to names of functions that modify their arguments

## Functions with Optional Arguments

You can define functions with optional arguments with default values.

$$
\begin{aligned}
& \text { julia> function point }(x, y, z=0) \\
& \text { println("\$x, } \$ y, \$ z ") \\
& \text { end } \\
& \text { julia> point }(1,2) ; \operatorname{point}(1,2,3)
\end{aligned}
$$

## Keywords and Positional Arguments

Keywords can be used to label arguments. Use a semicolon after the function's unlabelled arguments, and follow it with one or more keyword=value pairs
julia> function func(a, b, c="one"; d="two") println("\$a, \$b, \$c, \$d") end
julia> func(1,2); func(d="four", 1, 2, "three")

## Anonymous Functions

As functions in Julia are first-class objects, they can be created anonymously without a name.

$$
\begin{array}{cc}
\text { julia> } x->2 x-1 \\
\text { julia> function (x) } \\
& 2 x-1 \\
& \text { end }
\end{array}
$$

An anonymous function is primarily used to feed in other functions.

$$
\begin{aligned}
& \text { julia> } \operatorname{map}((x, y, z)->x+y+z, \\
& {[1,2,3],[4,5,6],[7,8,9]) }
\end{aligned}
$$

## "Dotted" Function

Dot syntax can be used to vectorize functions, i.e., applying functions elementwise to arrays.

$$
\begin{aligned}
& \text { julia> func(a, b) }=a * b \\
& \text { julia> func( } 1,2) \\
& \text { julia> func. }([1,2], 3) \\
& \text { julia> sin.(func. }([1,2],[3,4]))
\end{aligned}
$$

## Function of Function

Julia functions can be treated the same as other Julia objects. You can return a function within a function.
julia> function my_exp_func(x) $f=$ function ( $y$ ) return $y^{\wedge} x$ end return f
end
julia> squarer=my_exp_func(2); quader=my_exp_func(3)
julia> squarer(3)
julia> quader(3)

## Part IV. Basics of Julia

2. Data Structures: Tuples, Arrays, Sets, and Dictionaries

## Tuples

A tuple is an ordered sequence of elements. Tuples are good for small fixed-length collections. Tuples are immutable.

$$
\begin{aligned}
& \text { julia> } t=(1,2,3) \\
& \text { julia> } t=((1,2),(3,4)) \\
& \text { julia> } t[1][2]
\end{aligned}
$$

## Arrays

An array is an ordered collection of elements. In Julia, arrays are used for lists, vectors, tables, and matrices. Arrays are mutable.

```
julia> a = [1, 2, 3] # column vecor
```



```
julia> c = [1 2 3; 4 5 6] # 2x3 vector
julia> d = [n^2 for n in 1:5]
julia> f = zeros(2,3); g = rand(2,3)
julia> h = ones(2,3); j = fill("A",9)
julia> k = reshape(rand(5,6),10,3)
julia> [a a] # hcat
julia> [b;b] # vcat
```


## Array \& Matrix Operations

Many Julia operators and functions can be used preceded with a dot. These versions are the same as their non-dotted versions, and work on the arrays element by element.

```
julia> b = [1 2 3; 4 5 7; 7 8 9]
julia> b .+ 10 # each element + 10
julia> sin.(b) # sin function
julia> b' # transpose (transpose(b))
julia> inv(b) # inverse
julia> b * b # matrix multiplication
julia> b .* b # element-wise multiplication
julia> b .^ 2 # element-wise square
```


## Sets

Sets are mainly used to eliminate repeated numbers in a sequence/list.
It is also used to perform
some standard set operations.
A could be created with the Set constructor function

## Examples:

```
julia> months=Set(["Nov","Dec","Dec"])
julia> typeof(months)
julia> push!(months,"Sept")
julia> pop!(months,"Sept")
julia> in("Dec", months)
julia> m=Set(["Dec","Mar","Feb"])
julia> union(m,months)
julia> intersect(m,months)
julia> setdiff(m,months)
```


## Dictionaries

Dictionaries are mappings between keys and items stored in the dictionaries. Alternatively one can think of dictionaries as sets in which something stored against every element of the set. To define a dictionary, use Dict()

## Examples:

```
julia> m=Dict("Oct"=>"October",
    "Nov"=>"November",
                            "Dec"=>"December")
julia> m["Oct"]
julia> get(m, "Jan", "N/A")
julia> haskey(m, "Jan")
julia> m["Jan"]="January"
julia> delete!(m, "Jan")
julia> keys(m)
julia> values(m)
julia> map(uppercase, collect(keys(m)))
```


## Part IV. Basics of Julia

3. Conditional Statements
\& Loops


Image Credit: https://www.geeksforgeeks.org

## Controlling Blocks

Julia has the following controlling constructs

- ternary expressions
- boolean switching expressions
- if elseif else end - conditional evaluation
- for end - iterative evaluation
- while end - iterative conditional evaluation
- try catch error throw exception handling


## Ternary and Boolean Expressions

A ternary expression can be constructed with the ternary operator

$$
\begin{aligned}
& \text { "?" and ":", } \\
& \text { julia> } x=1 \\
& \text { julia> } x>0 \text { ? } \sin (x): \cos (x)
\end{aligned}
$$

You can combine the boolean condition and any expression using \&\& or II, julia> isodd(41) \&\& println("That's odd!")

## Conditional Statements

Execute statements if condition is true.

There is no "switch" and "case" statement in Julia.

There is an "ifelse" statement.

```
julia> a = 8
julia> if a>10
    println("a > 10")
    elseif a<10
    println("a < 10")
    else
        println("a = 10")
    end
```

julia> s = ifelse(false, "hello", "goodbye") * " world"

## Loop Control Statements - for

for statements help repeatedly execute a block of code for a certain number of iterations. Loop variables are local.

```
julia> for i in 0:1:10
        if i % 3 == 0
                        continue
            end
            println(i)
            end
julia> for l in "julia"
                print(1, "-^-")
    end
```


## Other Usage of for Loops

Array comprehension:

```
julia> [n for n in 1:10]
```

Array enumeration:

```
julia> [i for i in enumerate(rand(3))]
```

Generator expressions:

```
julia> sum(x for x in 1:10)
```

Nested loop:

```
for x in 1:10, y in 1:10
    @show (x, y)
    if y % 3 == 0
        break
    end
end
```


## Loop Control Statements - while

while statements repeatedly execute a block of code as long as a condition is satisfied.

$$
\begin{aligned}
& \text { julia> } n=1 \\
& \text { julia> } s=0 \\
& \text { julia> while } n<=100 \\
& \qquad \begin{array}{rl}
s & =s+n \\
n & n+n+1
\end{array} \\
& \text { end } \\
& \text { julia> println(s) }
\end{aligned}
$$

## Exception Handling Blocks

try ... catch construction checks for errors and handles them gracefully,

```
julia> s = "test"
julia> try
    s[1] = "p"
    catch err
        println("caught an error: $err")
    println("continue with execution!")
end
```


## Part V. <br> Plotting with Julia



## UnicodePlots

UnicodePlots is simple and lightweight and it plots directly in your terminal (might not work with web-based shell).

```
julia> using Plots
julia> unicodeplots()
julia> plot(rand(5,5),
linewidth=2, title="My
Plot")
```



## Plotly Julia Library

Plotly creates leading open source software for Web-based data visualization and analytical apps. Plotly Julia Library makes interactive, publication-quality graphs online (not working with web-based shell).

```
julia> using Plots
julia> plotly()
julia> plot(rand(5,5),
linewidth=2, title="My
Plot")
```


## GR Framework

GR framework is a universal framework for cross-platform visualization applications (not working with web-based shell).
julia> using Plots
julia> gr()
julia> plot(rand(5,5), linewidth=4, title="My
Plot", size=(1024,1024))


## Fractal

- Fractal refers to geometric shapes containing detailed structure at arbitrarily small scales.
- Fractals appear similar at various scales.



## Benoit Mandelbrot Set

$$
z_{n+1}=z_{n}^{2}+c
$$

- z and c are complex numbers.
- Starting with $z_{0}=0$.
- Mendelbrot set is the set of values of $c$ when $z_{n}$ remains bounded for a relatively large $n$.



## Mandelbrot - Julia Version

```
function mandelbrot(a)
    z = 0
    for i=1:50
        z = z^2 + a
    end
    return z
end
for y=1.0:-0.05:-1.0
    for x=-2.0:0.0315:0.5
        abs(mandelbrot(complex(x, y))) < 2
? print("*") : print(" ") # in one line
    end
    println()
end
```



The first published picture of the Mandelbrot set, by Robert W. Brooks and Peter Matelski in 1978, reproduced with the code to the left.

## Online Resources

Official Julia Document
https://docs.julialang.org/en/v1/
Julia Online Tutorials
https://julialang.org/learning/
Introducing Julia (Wikibooks.org)
https://en.wikibooks.org/wiki/Introducing_Julia
MATLAB-Python-Julia cheatsheet
https://cheatsheets.quantecon.org/
The Fast Track to Julia
https://juliadocs.github.io/Julia-Cheat-Sheet/

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## Appendix

## Modules and Packages

Julia code is organized into files, modules, and packages. Files containing Julia code use the .jl file extension. Modules can be defined as

> module MyModule
end

Julia manages its packages with Pkg

$$
\begin{aligned}
& \text { julia> Pkg.add("MyPackage") } \\
& \text { julia> Pkg.status() } \\
& \text { julia> Pkg.update() } \\
& \text { julia> Pkg.rm("MyPackage") }
\end{aligned}
$$

## ASCII Code

When you press a key on your computer keyboard, the key that you press is translated to a binary code.

$$
\begin{array}{rlr}
A=1000001 & (\text { Decimal }=65) \\
a=1100001 & (\text { Decimal }=97) \\
0=0110000 & & (\text { Decimal }=48)
\end{array}
$$

## ASCII Code

## ASCII stands for American Standard Code for Information Interchange

| Dec | Hex | Char | Dec | Hex | Char | Dec | Hex | Char | Dec | Hex | Char |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 00 | Null | 32 | 20 | Space | 64 | 40 | d | 96 | 60 |  |
| 1 | 01 | Start of heading | 33 | 21 | ! | 65 | 41 | A | 97 | 61 | a |
| 2 | 02 | Start of text | 34 | 22 | " | 66 | 42 | B | 98 | 62 | b |
| 3 | 03 | End of text | 35 | 23 | \# | 67 | 43 | C | 99 | 63 | $c$ |
| 4 | 04 | End of transmit | 36 | 24 | \$ | 68 | 44 | D | 100 | 64 | d |
| 5 | 05 | Enquiry | 37 | 25 | \% | 69 | 45 | E | 101 | 65 | e |
| 6 | 06 | Acknowledge | 38 | 26 | $\varepsilon$ | 70 | 46 | F | 102 | 66 | f |
| 7 | 07 | Audible bell | 39 | 27 | 1 | 71 | 47 | G | 103 | 67 | g |
| 8 | 08 | Backspace | 40 | 28 | ( | 72 | 48 | H | 104 | 68 | h |
| 9 | 09 | Horizontal tab | 41 | 29 | ) | 73 | 49 | I | 105 | 69 | i |
| 10 | OA | Line feed | 42 | 2 A | * | 74 | 4 A | J | 106 | 6 A | j |
| 11 | OB | Vertical tab | 43 | 2B | $+$ | 75 | 4 B | K | 107 | 6 B | k |
| 12 | OC | Form feed | 44 | 2C | , | 76 | 4 C | L | 108 | 6 C | 1 |
| 13 | OD | Carriage return | 45 | 2D | - | 77 | 4D | M | 109 | 6D | m |
| 14 | OE | Shift out | 46 | 2 E | - | 78 | 4 E | N | 110 | 6 E | n |
| 15 | OF | Shift in | 47 | 2 F | 7 | 79 | 4 F | $\bigcirc$ | 111 | 6 F | $\bigcirc$ |
| 16 | 10 | Data link escape | 48 | 30 | 0 | 80 | 50 | P | 112 | 70 | p |
| 17 | 11 | Device control 1 | 49 | 31 | 1 | 81 | 51 | Q | 113 | 71 | q |
| 18 | 12 | Device control 2 | 50 | 32 | 2 | 82 | 52 | R | 114 | 72 | r |
| 19 | 13 | Device control 3 | 51 | 33 | 3 | 83 | 53 | 5 | 115 | 73 | 3 |
| 20 | 14 | Device control 4 | 52 | 34 | 4 | 84 | 54 | T | 116 | 74 | t |
| 21 | 15 | Neg. acknowledge | 53 | 35 | 5 | 85 | 55 | U | 117 | 75 | u |
| 22 | 16 | Synchronous idle | 54 | 36 | 6 | 86 | 56 | V | 118 | 76 | v |
| 23 | 17 | End trans. block | 55 | 37 | 7 | 87 | 57 | W | 119 | 77 | w |
| 24 | 18 | Cancel | 56 | 38 | 8 | 88 | 58 | X | 120 | 78 | x |
| 25 | 19 | End of medium | 57 | 39 | 9 | 89 | 59 | Y | 121 | 79 | Y |
| 26 | 1 A | Substitution | 58 | 3A | : | 90 | 5 A | Z | 122 | 7 A | $z$ |
| 27 | 1B | Escape | 59 | 3 B | ; | 91 | 5 B | [ | 123 | 7 B | \{ |
| 28 | 1C | File separator | 60 | 3 C | $<$ | 92 | 5 C | 1 | 124 | 7 C | 1 |
| 29 | 1D | Group separator | 61 | 3 D | = | 93 | 5D | ] | 125 | 7 D | ) |
| 30 | 1E | Record separator | 62 | 3 E | $>$ | 94 | 5 E | $\wedge$ | 126 | 7 E | $\sim$ |
| 31 | 1 F | Unit separator | 63 | 3 F | ? | 95 | 5 F |  | 127 | 7 F | $\square$ |

## Terminology

A bit is short for binary digit. It has only two possible values: On (1) or Off (0).
A byte is simply a string of 8 bits.
A kilobyte (KB) is $1,024\left(2^{\wedge} 10\right)$ bytes.
A megabyte (MB) is $1,024 \mathrm{~KB}$ or $1,024^{\wedge} 2$ bytes.
A gigabyte (GB) is $1,024 \mathrm{MB}$ or $1,024^{\wedge} 3$ bytes.

