This page's source is located here . Pull requests are welcome!

#### What is...?

Julia is an open-source, multi-platform, high-level, high-performance programming language for technical computing.

Julia has an LLVM-based JIT compiler that allows it to match the performance of languages such as C and FORTRAN without the hassle of low-level code. Because the code is compiled on the fly you can run (bits of) code in a shell or REPL, which is part of the recommended workflow.

Julia is dynamically typed, provides multiple dispatch, and is designed for parallelism and distributed computation.

Julia has a built-in package manager.

Julia has many built-in mathematical functions, including special functions (e.g. Gamma), and supports complex numbers right out of the box.

Julia allows you to generate code automagically thanks to Lisp-inspired macros.

Julia was created in 2012.

### **Basics**

Assignment answer = 42
x, y, z = 1, [1:10; ], "A string"
x, y = y, x # swap x and y

Constant declaration const DATE\_OF\_BIRTH = 2012
End-of-line comment i = 1 # This is a comment

Delimited comment #= This is another comment =#

x = y = z = 1 # right-to-left Chaining 0 < x < 3 # true

5 < x != y < 5 # false function add one(i)

Function definition return i + 1

end

Insert LaTeX symbols \delta + [Tab]

# **Operators**

Basic arithmetic +, -,\*,/
Exponentiation 2^3 == 8

Division 3/12 == 0.25

Inverse division 7\3 == 3/7

Remainder x % y or rem(x, y)

Remainder x % y or rem(x,y)

Negation !true == false

**Equality** a == b

Inequality a != b or a ≠ b

Less and larger than < and > Less than or equal to <= or  $\leq$  Greater than or equal to >= or  $\geq$ 

Element-wise operation [1, 2, 3] .+ [1, 2, 3] == [2, 4, 6][1, 2, 3] .\* [1, 2, 3] == [1, 4, 9]

Not a number isnan(NaN) not(!) NaN == NaN

Ternary operator a == b ? "Equal" : "Not equal"

Short-circuited AND and OR a && b and a || b

Object equivalence a === b

### The shell a.k.a. REPL

Recall last result ans

Interrupt execution [Ctrl] + [C] Clear screen [Ctrl] + [L]

Run program include("filename.jl")

?func

Get help for func is defined

See all places where func is defined apropos("func")
Command line mode ; on empty line
Package Manager mode ] on empty line
Help mode ? on empty line

Exit special mode / Return to REPL [Backspace] on empty line

Exit REPL exit() or [Ctrl] + [D]

### **Standard libraries**

To help Julia load faster, many core functionalities exist in standard libraries that come bundled with Julia. To make their functions available, use using PackageName. Here are some Standard Libraries and popular functions.

Random rand, randn, randsubseq

Statistics mean, std, cor, median, quantile
LinearAlgebra I, eigvals, eigvecs, det, cholesky

SparseArrays sparse, SparseVector, SparseMatrixCSC

Distributed @distributed, pmap, addprocs

Dates DateTime, Date

## Package management

Packages must be registered before they are visible to the package manager. In Julia 1.0, there are two ways to work with the package manager: either with using Pkg and using Pkg functions, or by typing ] in the REPL to enter the special interactive package management mode. (To return to regular REPL, just hit BACKSPACE on an empty line in package management mode). Note that new tools arrive in interactive mode first, then usually also become available in regular Julia sessions through Pkg module.

## Using Pkg in Julia session

List installed packages (human-readable) Pkg.status()
Update all packages Pkg.update()

Install PackageNamePkg.add("PackageName")Rebuild PackageNamePkg.build("PackageName")

Use PackageName (after install)using PackageNameRemove PackageNamePkg.rm("PackageName")

## In Interactive Package Mode

Add PackageName

Remove PackageName

Update PackageName

Use development version

add PackageName

rm PackageName

update PackageName

dev PackageName or

Use development version dev GitRepoUrl

Stop using development version, revert to

public release

free PackageName

# **Characters and strings**

```
chr = 'C'
Character
                                   str = "A string"
String
                                   Int('J') == 74
Character code
Character from code
                                   Char(74) == 'J'
                                   chr = '\uXXXX'
                                                       # 4-digit HEX
Any UTF character
                                   chr = '\UXXXXXXXX' # 8-digit HEX
                                   for c in str
Loop through characters
                                       println(c)
                                   end
                                   str = "Learn" * " " * "Julia"
Concatenation
                                   a = b = 2
String interpolation
                                   println("a * b = $(a*b)")
                                   findfirst(isequal('i'), "Julia")
First matching character or regular
expression
                                   replace("Julia", "a" => "us") ==
Replace substring or regular
                                   "Julius"
expression
Last index (of collection)
                                   lastindex("Hello") == 5
Number of characters
                                   length("Hello") == 5
Regular expression
                                   pattern = r"l[aeiou]"
                                   str = "+1 234 567 890"
                                   pat = r" + ([0-9]) ([0-9]+)"
Subexpressions
                                   m = match(pat, str)
                                   m.captures == ["1", "234"]
                                   [m.match for m = eachmatch(pat,
All occurrences
                                   str)]
All occurrences (as iterator)
                                   eachmatch(pat, str)
Beware of multi-byte Unicode encodings in UTF-8:
10 == lastindex("Ångström") != length("Ångström") == 8
Strings are immutable.
```

### **Numbers**

Integer types IntN and UIntN, with

 $N \in \{8, 16, 32, 64, 128\}$ , BigInt

Floating-point types FloatN with  $N \in \{16, 32, 64\}$ 

BigFloat

Minimum and maximum typemin(Int8) values by type typemax(Int64)
Complex types Complex{T}

Imaginary unit im

Machine precision eps() # same as eps(Float64)
round() # floating-point

Rounding round(Int, x) # integer

convert(TypeName, val) # attempt/error

Type conversions

typename(val) # attempt/error

typename(val) # calls convert

typendie(vat) # catts conve

рі # 3.1415... п # 3 1*4*15

Global constants \(\pi \) # 3.1415...

im # real(im \* im) == -1

More constants using Base.MathConstants

Julia does not automatically check for numerical overflow. Use package SaferIntegers for ints with overflow checking.

### **Random Numbers**

Many random number functions require using Random.

Set seed seed!(seed)

rand() # uniform [0,1)
Pandom numbers

Random numbers randn() # normal (-Inf,

TUT)

using Distributions

Random from Other Distribution my\_dist = Bernoulli(0.2) #

For example

rand(my\_dist)

Random subsample elements from A with

inclusion probability p

randsubseq(A, p)

Random permutation elements of A shuffle(A)

## Arrays

```
Declaration
                                   arr = Float64[]
Pre-allocation
                                   sizehint!(arr, 10^4)
                                   arr = Any[1,2]
Access and assignment
                                   arr[1] = "Some text"
                                   a = [1:10;]
                                   b = a
                                               # b points to a
Comparison
                                   a[1] = -99
                                   a == b
                                              # true
                                   b = copy(a)
Copy elements (not address)
                                   b = deepcopy(a)
Select subarray from m to n
                                   arr[m:n]
n-element array with 0.0s
                                   zeros(n)
n-element array with 1.0s
                                   ones(n)
n-element array with #undefs
                                   Vector{Type}(undef,n)
n equally spaced numbers from
                                   range(start,stop=stop,length=n)
start to stop
Array with n random Int8
                                   rand(Int8, n)
elements
Fill array with val
                                   fill!(arr, val)
Pop last element
                                   pop!(arr)
Pop first element
                                   popfirst!(a)
Push val as last element
                                   push!(arr, val)
Push val as first element
                                   pushfirst!(arr, val)
Remove element at index idx
                                   deleteat!(arr, idx)
Sort
                                   sort!(arr)
Append a with b
                                   append!(a,b)
                                   in(val, arr) or val in arr
Check whether val is element
Scalar product
                                   dot(a, b) == sum(a .* b)
                                   reshape(1:6, 3, 2)' == [1 2 3; 4 5
Change dimensions (if possible)
To string (with delimiter del
                                   join(arr, del)
between elements)
```

# **Linear Algebra**

For most linear algebra tools, use using Linear Algebra.

I # just use variable I. Will automatically

conform to dimensions required.

Define matrix  $M = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$ 

Matrix dimensions size(M)
Select i th row M[i, :]
Select i th column M[:, i]

Concatenate M = [a b] or M = hcat(a, b)

Concatenate vertically M = [a ; b] or M = vcat(a, b)

Matrix transposition transpose(M)

Conjugate matrix M' or adjoint(M) transposition

Matrix trace tr(M)
Matrix determinant det(M)
Matrix rank rank(M)
Matrix eigenvalues eigvals(M)

Matrix eigenvectors eigvecs(M)

Matrix inverse inv(M)

Solve M\*x == v  $M \setminus v$  is better than inv(M)\*v

Moore-Penrose pseudo-inverse pinv(M)

Julia has built-in support for matrix decompositions.

Julia tries to infer whether matrices are of a special type (symmetric, hermitian, etc.), but sometimes fails. To aid Julia in dispatching the optimal algorithms, special matrices can be declared to have a structure with functions like Symmetric, Hermitian, UpperTriangular, LowerTriangular, Diagonal, and more.

```
Control flow and loops
```

```
Conditional
                     if-elseif-else-end
                     for i in 1:10
Simple for loop
                          println(i)
                     end
                     for i in 1:10, j = 1:5
Unnested for loop
                          println(i*j)
                     end
                     for (idx, val) in enumerate(arr)
Enumeration
                          println("the $idx-th element is $val")
                      end
                     while bool_expr
while loop
                          # do stuff
                      end
Exit loop
                      break
Exit iteration
                     continue
```

### **Functions**

All arguments to functions are passed by reference.

Functions with ! appended change at least one argument, typically the first: sort!(arr).

Required arguments are separated with a comma and use the positional notation.

Optional arguments need a default value in the signature, defined with =.

Keyword arguments use the named notation and are listed in the function's signature after the semicolon:

```
function func(req1, req2; key1=dflt1, key2=dflt2)
    # do stuff
end
```

The semicolon is *not* required in the call to a function that accepts keyword arguments.

The return statement is optional but highly recommended.

Multiple data structures can be returned as a tuple in a single return statement.

Command line arguments julia script.jl arg1 arg2... can be processed from global constant ARGS:

```
for arg in ARGS
    println(arg)
end
```

julia> A = rand(3, 4);

iulia> B = A .- mean(A. dims=1)

Anonymous functions can best be used in collection functions or list comprehensions:  $x \rightarrow x^2$ .

Functions can accept a variable number of arguments:

```
function func(a...)
     println(a)
 end
 func(1, 2, [3:5]) # tuple: (1, 2, UnitRange{Int64}[3:5])
Functions can be nested:
 function outerfunction()
     # do some outer stuff
     function innerfunction()
         # do inner stuff
         # can access prior outer definitions
     end
     # do more outer stuff
 end
Functions can have explicit return types
 # take any Number subtype and return it as a String
 function stringifynumber(num::T)::String where T <: Number</pre>
     return "$num"
 end
Functions can be vectorized by using the Dot Syntax
 # here we broadcast the subtraction of each mean value
 # by using the dot operator
 julia> using Statistics
```

```
3×4 Array{Float64,2}:

0.0387438

0.112224

0.000773337

0.250006

0.0140011

-0.289532

-0.0395171

-0.36223

0.0401467

0.165713

julia> mean(B, dims=1)

1×4 Array{Float64,2}:

-7.40149e-17

7.40149e-17

1.85037e-17

3.70074e-17
```

Julia generates specialized versions of functions based on data types. When a function is called with the same argument types again, Julia can look up the native machine code and skip the compilation process.

Since Julia 0.5 the existence of potential ambiguities is still acceptable, but actually calling an ambiguous method is an immediate error.

Stack overflow is possible when recursive functions nest many levels deep. Trampolining can be used to do tail-call optimization, as Julia does not do that automatically yet. Alternatively, you can rewrite the tail recursion as an iteration.

### **Dictionaries**

```
d = Dict(key1 => val1, key2 => val2,
Dictionary
                            d = Dict(:key1 => val1, :key2 => val2,
                            ...)
All keys (iterator)
                            keys(d)
All values (iterator)
                            values(d)
                            for (k,v) in d
Loop through key-value
                                 println("key: $k, value: $v")
pairs
                            end
Check for key:k
                            haskey(d, :k)
                            arr = collect(keys(d))
Copy keys (or values) to
array
                            arr = [k for (k,v) in d]
Dictionaries are mutable; when symbols are used as keys, the keys are
```

#### Sets

immutable.

```
Declaration s = Set([1, 2, 3, "Some text"])

Union s1 \cup s2 union(s1, s2)

Intersection s1 \cap s2 intersect(s1, s2)

Difference s1 \setminus s2 setdiff(s1, s2)

Difference s1 \triangle s2 symdiff(s1, s2)

Subset s1 \subseteq s2 is subset(s1, s2)

Checking whether an element is contained in a set is done in O(1).
```

# **Collection functions**

Apply f to all elements of collection

coll

Filter coll for true values of f

List comprehension

map(f, coll) or map(coll) do elem # do stuff with elem # must contain return end filter(f, coll)

arr = [f(elem) for elem in
coll]

### Types

Julia has no classes and thus no class-specific methods.

Types are like classes without methods.

Abstract types can be subtyped but not instantiated.

Concrete types cannot be subtyped.

By default, struct s are immutable.

Immutable types enhance performance and are thread safe, as they can be shared among threads without the need for synchronization.

Objects that may be one of a set of types are called Union types.

Type annotation var::TypeName

> struct Programmer name::String

Type declaration birth year::UInt16

fave language::AbstractString

end

Mutable type declaration replace struct with mutable struct

const Nerd = Programmer Type alias

methods(TypeName) Type constructors

me = Programmer("Ian", 1984, "Julia") Type instantiation

me = Nerd("Ian", 1984, "Julia")

abstract type Bird end

struct Duck <: Bird Subtype declaration pond::String

struct Point{T <: Real}</pre>

x::Ty::T

Parametric type end

p =Point{Float64}(1,2)

Union types Union{Int, String}

Traverse type hierarchy supertype(TypeName) and subtypes(TypeName)

Default supertype Any

All fields fieldnames(TypeName)

All field types TypeName.types

When a type is defined with an *inner* constructor, the default *outer* constructors are not available and have to be defined manually if need be. An inner constructor is best used to check whether the parameters conform to certain (invariance) conditions. Obviously, these invariants can be violated by accessing and modifying the fields directly, unless the type is defined as immutable. The new keyword may be used to create an object of the same type.

invariant, which parameters are means Point{Float64} <: Point{Real} is false, even though Float64 <: Real. Tuple types, on the other hand, аге covariant: Tuple{Float64} <: Tuple{Real}.</pre>

The type-inferred form of Julia's internal representation can be found with

code\_typed(). This is useful to identify where Any rather than type-specific native code is generated.

# Missing and Nothing

Programmers Null nothing Missing Data missing Not a Number in NaN Float

collect(skipmissing([1, 2, missing])) == Filter missings

[1,2]

collect((df[:col], 1)) Replace missings

Check if missing ismissing(x) **not** x == missing

## **Exceptions**

```
Throw SomeExcep
                    throw(SomeExcep())
Rethrow current
                    rethrow()
exception
                    struct NewExcep <: Exception
                        v::String
                    end
Define NewExcep
                    Base.showerror(io::IO, e::NewExcep) = print(io,
                    "A problem with $(e.v)!")
                    throw(NewExcep("x"))
Throw error with
                    error(msg)
msg text
                    try
                        # do something potentially iffy
                    catch ex
                        if isa(ex, SomeExcep)
                            # handle SomeExcep
                        elseif isa(ex, AnotherExcep)
Handler
                            # handle AnotherExcep
                            # handle all others
                        end
                    finally
                        # do this in any case
                    end
```

#### **Modules**

Modules are separate global variable workspaces that group together similar functionality.

```
module PackageName
                  # add module definitions
Definition
                  # use export to make definitions accessible
Include
                  include("filename.jl")
filename.jl
                  using ModuleName
                                          # all exported names
                  using ModuleName: x, y
                                                       # only x, y
                  import ModuleName # only ModuleName
Load
                  import ModuleName: x, y
                                                       # only x, y
                  import ModuleName.x, ModuleName.y # only x, y
                   # Get an array of names exported by Module
                  names(ModuleName)
                  # include non-exports, deprecateds
                  # and compiler-generated names
Exports
                  names(ModuleName, all::Bool)
                  #also show names explicitly imported from other
                  modules
                  names(ModuleName, all::Bool, imported::Bool)
```

With using Foo you need to say function Foo.bar(... to extend module Foo's function bar with a new method, but with import Foo.bar, you only need to say function bar(... and it automatically extends module Foo's function bar.

## **Expressions**

Julia is homoiconic: programs are represented as data structures of the language itself. In fact, everything is an expression Expr.

Symbols are interned strings prefixed with a colon. Symbols are more efficient and they are typically used as identifiers, keys (in dictionaries), or columns in data frames. Symbols cannot be concatenated.

Quoting :( ... ) or quote ... end creates an expression, just like
Meta.parse(str), and Expr(:call, ...).
x = 1
line = "1 + \$x" # some code
expr = Meta.parse(line) # make an Expr object
typeof(expr) == Expr # true
dump(expr) # generate abstract syntax tree
eval(expr) == 2 # evaluate Expr object: true

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#### Macros

Macros allow generated code (i.e. expressions) to be included in a program.

```
macro macroname(expr)
```

Definition # do stuff

end

Usage @macroname(ex1, ex2, ...) **οr** @macroname ex1 ex2 ...

> @test # equal (exact) @test x ≈ y # isapprox(x, y)
> @assert # assert (unit test)
> @which # types used
> @time # time and memory state

# time and memory statistics

@time # time and ...
@elapsed # time elapsed
@allocated # memory allocated
@cofile # profile

Built-in macros

@profile # profile
@spawn # run at some worker
@spawnat # run at specified worker
@async # asynchronous task

@distributed # parallel for loop
@everywhere # make available to

# make available to workers

#### Rules for creating *hygienic* macros:

- Declare variables inside macro with local.
- Do not call eval inside macro.
- Escape interpolated expressions to avoid expansion: \$(esc(expr))

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# **Parallel Computing**

Parallel computing tools are available in the Distributed standard library.

```
Launch REPL with N workers
                                julia -p N
Number of available workers
                                nprocs()
Add N workers
                                addprocs(N)
                                for pid in workers()
See all worker ids
                                    println(pid)
                                end
Get id of executing worker
                                myid()
Remove worker
                                rmprocs(pid)
                                r = remotecall(f, pid, args...)
                                # or:
Run f with arguments args on
                                r = @spawnat pid f(args)
bia
                                fetch(r)
Run f with arguments args on
                                remotecall_fetch(f, pid, args...)
pid (more efficient)
Run f with arguments args on
                                r = @spawn f(args) ... fetch(<math>r)
any worker
Run f with arguments args on
                                r = [@spawnat w f(args) for w in
                                workers()] ... fetch(r)
all workers
Make expr available to all
                                @everywhere expr
workers
                                sum = @distributed (red) for i in
                                1:10^6
Parallel for loop with reducer
function red
                                    # do parallelstuff
                                end
Apply f to all elements in
                                pmap(f, coll)
collection coll
```

Workers are also known as concurrent/parallel processes.

Modules with parallel processing capabilities are best split into a functions file that contains all the functions and variables needed by all workers, and a driver file that handles the processing of data. The driver file obviously has to import the functions file.

A non-trivial (word count) example of a reducer function is provided by Adam DeConinck.

```
I/O
                   stream = stdin
                   for line in eachline(stream)
Read stream
                       # do stuff
                   end
                   open(filename) do file
                       for line in eachline(file)
Read file
                           # do stuff
                       end
                   end
                   using CSV
Read CSV file
                   data = CSV.read(filename)
                   using CSV
Write CSV file
                   CSV.write(filename, data)
                   using JLD
Save Julia Object
                   save(filename, "object_key", object, ...)
                   using JLD
Load Julia Object
                   d = load(filename) # Returns a dict of objects
                   using HDF5
Save HDF5
                   h5write(filename, "key", object)
                   using HDF5
Load HDF5
                   h5read(filename, "key")
```

### **DataFrames**

```
For dplyr-like tools, see DataFramesMeta.jl.
```

```
Read Stata, SPSS, etc.
                               StatFiles Package
Describe data frame
                               describe(df)
Make vector of column col
                               v = df[:col]
Sort by col
                               sort!(df, [:col])
Categorical col
                               categorical!(df, [:col])
List col levels
                               levels(df[:col])
All observations with col==val
                               df[df[:col] .== val, :]
                               stack(df, [1:n; ])
Reshape from wide to long
                               stack(df, [:col1, :col2, ...])
format
                               melt(df, [:col1, :col2])
Reshape from long to wide
                               unstack(df, :id, :val)
format
                               allowmissing!(df) or
Make Nullable
                               allowmissing!(df, :col)
                               for r in eachrow(df)
                                   # do stuff.
Loop over Rows
                                   # r is Struct with fields of col
                               names.
                               end
                               for c in eachcol(df)
                                   # do stuff.
Loop over Columns
                                   # c is tuple with name, then
                               vector
                               end
Apply func to groups
                               by(df, :group_col, func)
                               using Query
                               query = @from r in df begin
                                   Qwhere r.col1 > 40
Query
                                   @select {new_name=r.col1, r.col2}
                                   @collect DataFrame # Default:
                               iterator
                               end
```

## **Introspection and reflection**

Type	typeof(name)
Type check	isa(name, TypeName)
List subtypes	<pre>subtypes(TypeName)</pre>
List supertype	<pre>supertype(TypeName)</pre>
Function methods	methods(func)
JIT bytecode	<pre>code_llvm(expr)</pre>
Assembly code	<pre>code_native(expr)</pre>

# Noteworthy packages and projects

Many core packages are managed by communities with names of the form Julia[Topic].

Statistics JuliaStats

Scientific Machine SciML (DifferentialEquations.jl)

Learning

Machine Learning

Automatic differentiation
Numerical optimization
Plotting
Network (Graph) Analysis
Web
Geo-Spatial
JuliaDiff
JuliaOpt
JuliaPlots
JuliaGraphs
JuliaWeb
JuliaGeo

DataFrames # linear/logistic

regression

Distributions # Statistical distributions

Super-used Packages Flux # Machine learning

JuliaML

Gadfly # ggplot2-likeplotting
Graphs # Network analysis

TextAnalysis # NLP

## **Naming Conventions**

The main convention in Julia is to avoid underscores unless they are required for legibility.

Variable names are in lower (or snake) case: somevariable.

Constants are in upper case: SOMECONSTANT.

Functions are in lower (or snake) case: somefunction.

Macros are in lower (or snake) case: @somemacro.

Type names are in initial-capital camel case: SomeType.

Julia files have the jl extension.

For more information on Julia code style visit the manual: style guide.

# **Performance tips**

- Avoid global variables.
- Write type-stable code.
- Use immutable types where possible.
- Use sizehint! for large arrays.
- Free up memory for large arrays with arr = nothing.
- Access arrays along columns, because multi-dimensional arrays are stored in column-major order.
- Pre-allocate resultant data structures.
- Disable the garbage collector in real-time applications: disable\_gc().
- Avoid the splat (...) operator for keyword arguments.
- Use mutating APIs (i.e. functions with ! to avoid copying data structures.
- Use array (element-wise) operations instead of list comprehensions.
- Avoid try-catch in (computation-intensive) loops.
- Avoid Any in collections.
- Avoid abstract types in collections.
- Avoid string interpolation in I/O.
- Vectorizing does not improve speed (unlike R, MATLAB or Python).
- Avoid eval at run-time.

## **IDEs, Editors and Plug-ins**

- Juno (editor, maintenance-only mode)
- Jupyter (online IJulia notebook)
- Emacs Julia mode (editor)
- Pluto.jl (online IJulia notebook)
- vim Julia mode (editor)
- VS Code extension (editor)

#### Resources

- Official documentation .
- Learning Julia page.
- Month of Julia
- Community standards.
- Julia: A fresh approach to numerical computing (pdf)
- Julia: A Fast Dynamic Language for Technical Computing (pdf)

### **Videos**

- The 5th annual JuliaCon 2018
- The 4th annual JuliaCon 2017 (Berkeley)
- The 3rd annual JuliaCon 2016
- Getting Started with Julia by Leah Hanson
- Intro to Julia by Huda Nassar
- Introduction to Julia for Pythonistas by John Pearson

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