

# Introduction to julia

Presentation and Workshop

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### **Overview**

What is Julia?

**Installation & REPL** 

**Main features** 

**Packages** 

**Pluto Notebooks** 

Workshop: Let's get you started with Julia!



# What is Julia?



## **Goal: Scientific Computing & Fast Prototyping**

In scientific computing we need

- ▶ high performance to tackle large scale problems
  - ⇒ compiled languages (C/C++, Rust)
  - all types are known at compile time
  - static, hence maybe missing flexibility



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- high-level dynamic languages (like Python, Matlab, R)
  - ⇒ fast prototyping
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  - code is interpreted (slow)



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Often: Fast code is written in C/C++ and is interfaced.

⇒ new users might have to compile the C/C++ (e.g. MEX files)



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### A short history

**2009** Adam Edelman starts the project with Jeff Bezanson, Stefan Karpinski, Viral B. Shah

**2012** first public version

**2018** Julia 1.0, i.e. no breaking releases since then

2025 current version Julia 1.11.4



#### **Resources**

Main homepage https://julialang.org

**Documentation** https://docs.julialang.org/en/v1/

Modern Julia Workflows https://modernjuliaworkflows.org/

**Discourse** https://discourse.julialang.org

JuliaHub webfrontend for the General Registry
https://juliahub.com/ui/Packages

#### These slides

https://github.com/Julia-Users-Trondheim/ Intro-to-Julia/blob/main/presentation/ introduction-to-julia.pdf

or the QR code on the right





# **Installation & REPL**



### Installation

**Windows** Install Julia from the Microsoft Store by running this in the command prompt

winget install julia -s msstore

We can take a closer look at your individual installation after this presentation in the workshop.



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- easily define variables & functions
- ▶ include("script.jl"); to run a script.



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#### **Quick commands**

- **D** Quit
- ^ L Clear console screen
- **Up Arrow** last command

**(TAB)** autocomplete or proposed completions



### **REPL modes**

Starting with special characters on REPL enters specific modes

? help mode quick access to the documentation of a function

#### **Example**:

? sqrt displays the help for the sqrt function on REPL, see also the (HTML) documentation

https://docs.julialang.org/en/v1/base/math/#Base.sqrt-Tuple{Number}



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- ] package mode quick access to manage packages
- ; shell mode quick access to shell without exiting Julia, e. g. to change folders



# **Main features**



## **General philosophy & Code format**

### **Philosophy**

- Write functions not scripts
- Julia has data types, but not objects
- write generic code "acting" on data
- no need to write "vectorized code"
- avoid global variables



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#### **Format**

- blocks have an end
- ▶ Indentation with 4 spaces is recommended but not necessary
- ▶ functions that modify their data should be named with an !.



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▶ To install one for our demos use the package mode

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We will continue command demos in the Pluto notebook (similar to a Jupyter notebook, but with a persistent state)



### Iterate with for-loops

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end # prints "1 2 3 4"
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#### Combine several and use ∈

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for i \in 1:3, j \in 1:2

print(i,"x",j,", ")

end # prints 1 \times 1, 1 \times 2, ...
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    print(i,"×",j,", ")
end # prints 1×1, 1×2, ...
```

#### Or through several of same length

```
for (i,j) ∈ zip(1:4, 5:8)
    print(i,"|",j," ")
end # prints 1/5 2/6 3/7 4/8
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#### Loops with "unknown end"

```
i = 1;
# do as long as i <= 4
while i <= 4
    print(i," ");
    i += 1
end # also prints "1 2 3 4"</pre>
```



### **Control flow II: Conditionals**

Conditionals require an expression that evaluates to a Bool. Then

```
if (x > 3) || (z > 3) # brackets (x > 3) are optional
    print("x or z is at least 3")
else
    print("x,z are both 3 or less")
end
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Conditionals can be used inline with

```
y = (x > 4) ? 1 : 3*x
```



### **Defining functions**

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phase(z)

Compute the phase of a complex number z

"""

function phase(z)
    return atan(imag(z), real(z))
end
```

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#### Shorter form

```
magnitude(z) = sqrt(imag(z)^2+real(z)^2)
```



# More on functions I: positional & keyword args

positional optional parameters: providing defaults

```
f(a, b=2, c=3) = a*exp(b/c)
f(1) #equals f(1,2,3)
f(1,3) #equals f(1,3,3)
f(1,2,5) #provide b to set c=5
```

▶ short to write, but to set c, you always have to provide ъ



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- must state variable name to set a value, order is not important.
- You can "collect and pass on":

```
▶ h1(args...) = f(1, args...)
```

- ► h2(; kwargs...) = g(1; kwargs...)
- ▶ or combine both as h3(args...; kwargs...) = #def here



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    X .+= v # X an array, v a scalar: add to every entry
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Convention: modifying function names end with! and return the modified variable.



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ts = TimeSeries("A", [1,2,3])</pre>
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#### **Variant II.** mutable – reassign fields:

```
mutable struct Measurement <: ExperimentData
    name::String
    value::Float64
end # same constructor
m = Measurement("B", 3.1415)</pre>
```

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```
mutable struct TimeSeries2{T} <: ExperimentData
    param::T  # maybe some concentration
    data::Vector{T} # actually parametrized by element-type
end # Constructor now maybe a bit clumsy:
ts2 = TimeSeries2{Float64}(3.1415, [1.2, 1.3])</pre>
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- ► makes the previous (implicit) Vector{Any} to a concrete type
- owm constructor: Define a parametric function

```
function TimeSeries2(c::T, v::Vector{T}=fill(c,3)) where {T}
    return TimeSeries2{T}(c, v)
end # Then we additionally get
ts2 = TimeSeries2(3.1415)
```



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```
function k(a::Number, t::TimeSeries)
  TimeSeries(t.name, a .* t.data)
end
function k(a::String, t::TimeSeries)
  TimeSeries("$(a) $(t.name)", t.data)
end
function k(a::Number, ts::TimeSeries2)
    TimeSeries2(a*ts.param, a .* ts.data)
end
```



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```

### Avoid ambiguities. Defining

```
g(a::Float64, b) = 2*a+b
g(a, b::Float64) = a+2*b
makes g(1.0,2.0) ambiguous.
```



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h(x::Float64) = "C"
We get that
h.(["a", 1, 1.0im, 2.0])
is ["A", "B", "B", "C"]
\Rightarrow dispatch to
"most fitting"
method of a function
```

```
function k(a::Number, t::TimeSeries)
  TimeSeries(t.name, a .* t.data)
end
function k(a::String, t::TimeSeries)
 TimeSeries("$(a) $(t.name)", t.data)
end
function k(a::Number, ts::TimeSeries2)
    TimeSeries2(a*ts.param, a .* ts.data)
end
Avoid ambiguities. Defining
g(a::Float64, b) = 2*a+b
g(a, b::Float64) = a+2*b
makes g(1.0,2.0) ambiguous.
One has to define
```

g(a::Float64, b::Float64) = 2\*a + 2\*b



### **Operators are Functions**

```
Operators like +, *, ^ are functions. Add a method to + via
function Base.:+(t::TimeSeries, s::TimeSeries)
    if !(length(t.data)==length(s.data))
        error("Time series not of same length")
    end
    return TimeSeries(
        "$(t.name) and $(s.name)",
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To ensure same type parameter, define a function with
Base::+(t::TimeSeries2{T}, s::TimeSeries2{T}) where {T}
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Consider (actually taken from the Julia documentation)

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struct Polynomial{R}
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function (p::Polynomial)(x)
    v = p.coeffs[end] \# Horner Schema, (a_2x + a_1)x + a_0
    for i = (length(p.coeffs)-1):-1:1
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end
For p = Polynomial([1, 10, 100]); p(3) we get
100 \cdot 3^2 + 10 \cdot 3 + 1 = 931
```



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- ▶ logical indexing: in R x [x>3] has two alternatives in Julia
  - x[x .> 3] (uses a temporary vector memory)
  - filter(z->z>3, x) might be nicer to read
  - filter!(z->z>3, x) updates x inplace (avoid temp. memory)



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- dimensions are not "constant-broadcasted":
  - ightharpoonup [1:10] + [1:10] | creates a  $10 \times 10$  matrix in Matlab
  - ► [1:10] + [1:10] ' is a dimension mismatch, because a column vector can not be added to a row vector



# **Packages**



## Namespaces & Modules

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module MyModule #Same naming convention as types: CamelCase
  f(x) = x^2  # is exported
  struct MyField end # is not exported
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- ► Default packages are among others Base (loaded on start) LinearAlgebra, Random, Statistics, ...



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After a package is installed, it can be used executing the command using PackageName, PackageA, PackageB



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- ⇒ **Reproducible** environment / setup to run your experiments in



# **Pluto Notebooks**



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plutojl.org

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On terminal using Pluto; Pluto.run(); to start the webserver.



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#### **Live Demo**



## **Further topics**

- further default data structures
  - Dict dictionaries
  - ► NamedTuples as "lightweight, flexible" struct
  - ► Io reading/writing files
  - further packages from the Standard Library
- @macros rewriting code
- VS Code extension & the debugger
- specific packages for your concrete problems
- ► Test.jl and running tests on your own package
- Documenter.jl and creating a documentation for your own package
- package extensions and weak dependencies



## Thanks for your attention!

Are there (further) questions?



# Workshop: Let's get you started with Julia!