### **Foreword**

julia is a language which I have a love-hate relationship with. If the first programming language you learned is python, I think julia offers a fresh take on what you can do with computers while having the interactiveness of python. It has a lot of modern features built into the language, such as its just-in-time (JIT) compilation, multiple dispatch, and metaprogramming capabilities. It also comes with its own package manager, which is quite nice to use. This makes julia a great "advance" language for data scientists to learn after python. However, the julia ecosystem is not nearly as mature as python, as a lot of its packages are maintained by small communities, and some time they lead to down some dead ends.

Nonetheless, julia is a fun language to play with. julia often offers more flexibility and performance than python, and its ecosystem has a lot of interesting research codes which are often not found in other ecosystem. So in this lab, we are going to go through

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## **Key Concepts**

#### Julia has a JIT compiler

julia has a just-in-time(JIT) compiler, which means that the code you write is compiled to machine code on the fly. This allows you to write code that is as fast as C or Fortran, while still having the interactivity of python, such as a for-loop. This implies the first time you run a function in julia it will compile the function before executing it. This compilation will incur some overhead, but then the subsequent times using the function will just call the cache such that you don't have to pay the overhead again and again. We will dive into this later in the lab.

#### Julia has multiple dispatch

For the people who learn python as their first programming language, and perhaps engaged in some projects related to python, you may find julia quite odd in the sense that it does not have classes.

#### Julia has a package manager

## **Basic Syntax**

#### **Variables**

julia is similar to python in many ways. For example, a=1 will define a variable a with the value of 1. As we mentioned, julia 's multiple dispatch system relies on the type of the variable to determine which function to call, so it is important to learn how to inspect the type of a particular variable. You can check the type of a variable by using the typeof function. If you run typeof(a), it will return Int64 because 1 is an integer.

To define a list, the basic syntax is similar, that is a = [1, "hello", 3.14]. However, in order to get a list from say a range, the syntax is a bit different. Instead of a = list(range(1, 10)), you would write a = collect(1:10). There is a bunch of functions related to collection you can checkout here here.

From a python background, the biggest difference in defining variables in julia is in dictionary. In python, you would define a dictionary like this a = {"key": "value"}, but in julia, you would define a dictionary like this a = Dict("key" => "value"). Accessing an element remains the same as python

Similar to python, if you have a variable defined by referencing another variable, i.e. b = a while a = [1, 2], changing element in a will also change b automatically.

#### **Writing Structs**

While there is no class in <code>julia</code>, it is still useful to be able to bundle a bunch of variables together so you can access them easily. This called composite type in <code>julia</code>, and we use the <code>struct</code> keyword to define them. For example, you can define a struct like this:

```
struct myStruct
  name::String
  somedata::Vector{Int}
end
```

Note:: syntax is used to specify the type of the variable. In this case, name is a String and somedata is a vector of Int. You can create an instance of this struct like this:

```
a = myStruct("hello", [1, 2, 3])
```

#### **Functions**

It is fair to say julia centers around writing functions, and one of its most interesting features is multiple dispatch. In julia, you can define a function like this:

```
function f(x)
    return x + 1
end
```

Note that julia does not care about indentation, however it is still a good practice to indent your code properly.

So far we haven't seen much difference between python and julia in function definition. However, here comes the interesting bit, a function with the same name but with different argument types will be treated as a different function. For example, you can define a function like this:

```
function f(x::Int)
    return x + 1
end
```

And you can define another function with the same name but with a different argument type like this:

```
function f(x::String)
    return x * "!"
end
```

Now if we call f(1), it will return 2, and if we call f("hello"), it will return hello!. This is really powerful (and somewhat cursed), since it reduces the coding task to defining your struct and manipulating it with the function with argument that takes that sepcific type. This basically acts as a replace for method in class in python.

#### **Control Flow**

The syntax for defining control flow in julia is similar to python. The major difference between python and julia in syntax is since julia does not care about indentation, you need to use end to close the block of code. For example, you can define a for-loop like this:

```
for i in 1:10
println(i)
```

while loop and if-else statements are also similar to python, and you can find more detail here

What I want to highlight is julia 's JIT capability. Let's write a function that takes a long time to run:

```
function add100000000(x)
    for i in 1:100000000
        x += 1
    end
    return x
end
```

You can try to run this counter part in python and you will see that julia is much faster. And we can even dig into the internal of the function by using <code>@code\_llvm</code> to see the LLVM code generated by the function. In the <code>julia</code> REPL, you can run <code>@code\_llvm</code> add100000000(1) to see the LLVM code generated by the function, and you will see that the cached LLVM intermediate representation (IR) code actually already have the number of iterations in the code. This gives us hint that <code>julia</code> is capable to optimize the code and run it more efficient than <code>python</code>.

## Exercise: Writing an insertion sort algorithm again

#### Step 0: Download Julia

Follow the instruction on <u>here</u> to install julia on your machine.

#### Step 1: Clone the repository

Fork this repository and clone it to your local machine.

#### Step 2: Implement the sorting algorithm

Open the src/insertion\_sort.jl file and implement the insertion sort algorithm within insertion\_sort function.

#### **Step 3: Test the algorithm**

Once you have implemented the body of the algorithm, start the <code>julia</code> REPL and run the following command to test the algorithm:

- 1. Press ] to enter the package manager mode.
- 2. Run activate . to activate the project.
- 3. Run test to test the algorithm.

## Packaging code

Packaging code in julia could take a while to get used to. Instead of creating submodules by directories and \_\_init\_\_.py , fundamentally in julia you just include("file.jl") in your main module. Any subdirectories is just to group those files together. And instead of using syntax like from scipy.optimize import minimize to import a function from a submodules, one needs to export functions that are written such that they can be imported by the main module.

#### Step 0: Looking at some examples

Have a look these three examples: <u>DifferentialEquations.jl</u>, <u>Flux.jl</u>, and <u>CUDA.jl</u>.

#### Step 1: Create the main module

Step 2: Create a sub-module

## **Building documentation**

Documenter.jl

## Writing tests

#### Add Test to the dependency

Start the julia REPL, run ] to enter the package manager mode, and run add Test to add the Test package to the project.

#### Writing test suites

There are two levels of writing tests in <code>julia</code>: @test and @testset. The purpose of @test is to test a single function or statement, which is similar to test functions you have learned in the <code>python</code> session. On the other hand, you don't want your entire testsuite to exist whenever one function fails. In this case, you can use @testset to group tests together and isolate them from the rest of the tests.

#### Step 1: Write tests for the insertion sort algorithm

#### Step 2: Group tests together with @testset

#### **Running tests**

You have already tried running tests in the previous exercise. Once again, the way to run tests is to start the julia REPL, enter the package manager mode by pressing ], and run test to run the tests.

## **Best practices**

#### All roads lead to Rome

In python, the intention of the language is to have only one obvious way to a solution. Although that is often violated and people dunk on their motto, it is still largely true. Creating modules, writing classes, and writing tests, they can all be done in a similar fashion. On the other hand, there are many ways to do the same thing in <code>julia</code>. We have seen the three different ways to build your package hierarchy, and the support of metaprogramming in <code>julia</code> together with multiple dispatch allows you to come with wild solutions to your problems.

### Type stability

#### Write functions

This is something that took me a while to really understand what do they mean by

## **Development tips**

Use the REPL

Use the package manager

**Working with IDEs** 

## **Noteworthy libraries**

The SciML ecosystem

Flux