# Core Julia

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# 1 Core Julia

This chapter consists of six sections:

- 1. Variable names;
- 2. Operators;
- 3. Types;
- 4. Data Structure;
- 5. Control flow;
- 6. Functions.

# 1.1 Variable names

Variable names are case sensitive and Unicode names (in UTF-8 encoding) may be used. And names must begin with a letter, no matter lowercase or uppercase, an underscore or a Unicode code point larger than 00A0, and other Unicode points, even a latex symbol. We can also redefine the constants here, such as  $\pi$ . But bulid-in statements are not allowed in this language. The examples are below.

```
In [15]: ## right variable names
    z = 100
    y = 1.0
    s = "my_variable"
    data_science = "true"
    datascience = true

    ## wrong variable names are here if run them, return an error
    ## if = 1.2
    ## else = true
    ##
Out [15]: true
```

# 1.2 Operators

The operators are similar to *R* and *Python*. Four main categories of operators in Julia:

1. Arithmetic;

- 2. Updating;
- 3. Numeric comparison;
- 4. Bitwise.

```
In [16]: x = 2
    y = 3
    z = 4

    x + y
    x^y
    x += 2
    x
    y

Out[16]: 3
```

When constructing expressing with multiple operators, the order in which these operators are applied to the expression is known as operator precedence.

With the parentheses () inclueded in the expression, we can control the order by ourselves like the following code

# 1.3 Types

### 1.3.1 Numeric

Julia offers full support for real and complex numbers. The internal variable Sys.WORD\_SIZE displays the architecture type of the computer. Minimum and Maximum can be showed by typemin() and typemax().

```
In [18]: Sys.WORD_SIZE
Out[18]: 64
In [19]: typemax(Int)
Out[19]: 9223372036854775807
In [20]: typemin(Int)
Out[20]: -9223372036854775808
In [21]: typemax(Int64)
Out[21]: 9223372036854775807
```

```
In [22]: typemax(Float32)
Out[22]: Inf32
```

Some types use leftmost bit to control the sign, such as Int64, but others use that bit as value and without sign like UInt128.

Boolean values are 8-bit integers, with false being 0 and true being 1.Overflow errors will happen if the result is larger or smaller than its allowable size.

#### **1.3.2** Floats

Floats are similar to scientific notation. They are made up of three components: asigned interger whose length determines the precision, the base used to represent te number and a signed integer htat changes the magnitude of floating point number (the exponent). Float64 literals are distinguished by having an e before hte power, and can be defined in hexadecimal. Float32 literals are distinguished by having an f in place of the e. There are three Float64 values that do not occur on the real line:

- 1. Inf, positive indinity: a value larger than all finite floating point numbers, equal to itself, and greater than every other floating point value but NaN;
- 2. -Inf, negative infinity: a value less than all finite floating point numbers, equal to itself, and less than every other floating point value but NaN;
- 3. NaN, not a number: a value not equal to any floating point value, and not ==,< or > than any floating point value, including itself.

Some tips:

1. digit separation using an \_;

```
In [26]: x1 = 1.0
    x64 = 15e-15
    x32 = 2.5f-4
    println("x1 is ",typeof(x1))
    println("\nx64 is ", typeof(x64))
    println("\nx32 is ", typeof(x32))
```

In machine, it is defined that the smallest value is  $1 + z \neq 1$ . In Julia, the value of epsilon for a particular machine can be found via the eps() function.

The spacing between floating point numbers and the value of machine epsilon is important to understand because it can help avoid certain types of errors.

There are also float underflow errors, which occur when the result of a calculation is smaller than machine epsilon or when numbers of similar precision are subtracted.

### 1.3.3 Strings

In Julia, a string is a sequence of Unicode code points, using UTF-8 encoding. Characters in strings have an index value within the string. It is worth noting that Julia indices start at **position 1**, similar to **R** but different to **Python**. The key word end can be used to represent the last index. Herein, we will deal with ASCII characters only. Note that String is the built-in type for string and string literals, and Char is the built-in type used to represent single characters. In fact, Char is a numeric value representing a Unicode code point. The value of a string cannot be changed, i.e., strings are immutable, and a new string must be built from another string. Strings are defined by double or triple quotes.

```
In [30]: s1 = "Hi"
Out[30]: "Hi"
```

```
In [31]: s2 = """I have a "quote" character"""
Out[31]: "I have a \"quote\" character"
```

String can be sliced using range indexing, e.g., my\_string[4:6] would return a substring of my\_string containing the 4th, 5th and 6th charaters of my\_string. Concatenation can be done in two ways: using the string() function or with the \* operator. Note this is a somewhat unusual feature of Julia. many other language use + to perform concatenation. String interpolation takes place when a string literal is defined with a variable inside its instantiation. The cariable is prepended with \$. By using variables insider the string's definition, complex strings can be built in a readbale form, without multiple string multiplications.

```
In [32]: ## some examples of strings
         str = "Data science is fun!"
         str[1]
Out[32]: 'D': ASCII/Unicode U+0044 (category Lu: Letter, uppercase)
In [33]: str[end]
Out[33]: '!': ASCII/Unicode U+0021 (category Po: Punctuation, other)
In [34]: str[4:7]
Out[34]: "a sc"
In [35]: str[end-3:end]
Out[35]: "fun!"
In [36]: string(str," Sure is :)")
Out[36]: "Data science is fun! Sure is:)"
In [37]: str * "Sure is :)"
Out[37]: "Data science is fun!Sure is :)"
In [38]: # Interpolation
         "1+2=$(1+2)"
Out [38]: "1+2=3"
In [39]: word1="Julia"
         word2="data"
         word3="science"
         "$word1 is great for $word2 $word3"
Out[39]: "Julia is great for data science"
```

Strings can be comared lexicographically using comarsion operators, e.g. ==, >, etc. Lexicographical comparison involves sequentially comparing string elements with the same position, until one pair of elements falsiies the comparison, or the end of the string is reached. Some useful string functions are:

- findfirst(par,str) returns the indices of the characters in the string str matching the pattern pat.
- occursin(substr, str) returns true/false depending on the presence/absence of substr in str.
- 'repeat(str,n)' generates a new string that is the original string str repeated n times.
- 'length(str)' returns the number of charaters in the string str.
- 'replace(str,ptn => rep)' searches string str for the pattern ptn and, if it is present, replaces it with rep.

```
In [40]: # Lexicographical comparison
         s1 = "abcd"
         s2 = "abde"
         s1 == s2
Out[40]: false
In [41]: s1 < s2
Out[41]: true
In [42]: s1 > s2
Out[42]: false
In [43]: # String functions
         str = "Data science is fun!"
         findfirst("Data",str)
Out[43]: 1:4
In [44]: occursin("ata",str)
Out[44]: true
In [45]: replace(str,"fun"=>"great")
Out[45]: "Data science is great!"
```

Julia fully supports regular expressions (regexes). Regexes in Julia are fully Perl compatible and fully compatible and are used to hunt for patterns in string data. They are defined as string with a leading r outside the quotes. Regular expressions are commonly used with the following functions:

- occursin(regex,str) returns true/false if the regex has a match inthe string str.
- mathc(regex,str) returns the first match of regex in the string. If there is no match, it returns the special Julia value nothing.
- eachmatch(regex, str) returns all the matches of regex in the string str as an array.

Regexes are a very powerful programming tool for working with text data. However, an indepth discussion of them is beyond the scope of this book, and intersted readers are encouraged to consult Friedl(2006) for further details.

```
In [46]: # Regular expresions
         # match alpha-numeric charaters at the start of the str
         occursin(r"[a-zA-z0-9]",str)
Out[46]: true
In [47]: occursin(r"^[a-zA-z0-9]",str)
Out [47]: true
In [48]: occursin(r"[a-zA-z0-9]$",str)
Out[48]: false
In [49]: occursin(r"[^a-zA-Z0-9]",str)
Out [49]: true
In [50]: ## matches the first non-alpha-numeric character in the string
         match(r"[^a-zA-Z0-9]",str)
Out[50]: RegexMatch(" ")
In [51]: ## matches all the non-alpha-numeric characters in the string
         collect(eachmatch(r"[^a-zA-Z0-9]",str))
Out[51]: 4-element Array{RegexMatch,1}:
          RegexMatch(" ")
          RegexMatch(" ")
          RegexMatch(" ")
          RegexMatch("!")
```

### **1.3.4** Tuples

Tuples are a Julia type. They are an abstraction of function arguments without the function. The arguments are defined in a specific order and have well-defined types. Tuples can have any number of parameters, and they do not have field names. Fields are accessed by their index, and turples are defined using brackets () and commas. A very usefual feature of tuples in Julia is that each element of a tuple can have its own type. Variable values can be assigned directly from atuple where the value of each variable corresponds to a value in the tuple.

```
In [52]: # A tuple comprising only floats
         tup1 = (3.0, 0.1, 0.8, 1.9)
         typeof(tup1)
Out[52]: NTuple{4,Float64}
In [53]: ## A tuple comprising strings and floats
         tup2 = ("Data",2.5,"Science", 8.8)
         typeof(tup2)
Out[53]: Tuple{String,Float64,String,Float64}
In [54]: ## variable assignment
         a,b,c = ("Fast", 1, 5.2)
Out[54]: "Fast"
In [55]: b
Out[55]: 1
In [56]: c
Out[56]: 5.2
In [57]: (a,b,c)=("safa",2341,123.412)
         typeof(a)
Out[57]: String
```

# 1.4 Data Structures

# **1.4.1** Arrays

An array is a multidimensional grid that stores objects of any type. To improve preformance, arrays should contain only one specific type, e.g., Int. Arrays do not require vectroizing for fast array computations. The array implementation used by Julia is written in Julia and relies on the comiler for performace. The compiler uses type inference to make optimized code for array indexing, which makes programs more readable and easier to maintain. Arrays are a subtype of the AbstractArray type. As such, they are laid out as a contiguous block of memory. this is not true of other members of the AbstractArray type, such as SparseMatrixCSC and SubArray.

The type and dimensions of an array can be specified using Array{T}(D), where T is any valid Julia type and D is the dimension of the array. The first entry in the tuple D is a singleton that specifies how the array values are initialized. Users can specify undef to create an uninitialized array, nothing to create arrays with no value, or missing to create arrays of missing values. Arrays with different types can be created with type Any.

```
Out[58]: Array{Int64,1}
In [59]: # A 2\times2 matrix containting integers
         a2 = Array{Int64}(undef,(2,2))
Out[59]: 2@2 Array{Int64,2}:
          296955136 296955296
          296955280 112897568
In [60]: # A 2\times 2 matrix containing Any type
         a2 = Array(Any)(undef,(2,2))
Out[60]: 2@2 Array{Any,2}:
          #undef #undef
          #undef #undef
   In Julia, [] can also be used to generate arrays. In fact, the Vector(), Matrix() and collect()
functions can also be used
In [61]: ## A three-element row "Vector"
         a4 = [1,2,3]
         typeof(a4)
Out[61]: Array{Int64,1}
   The array a4 above does not have a second dimension, i.e., it is neither a 1 \times 3 vector nor a
3 \times 1 vector. In other words, Julia makes a distinction between Array{T,1} and Array{T,2}.
In [62]: ## A 1\times 3 colum vector -- a two-dimensional array
         a5 = [1 \ 2 \ 3]
         typeof(a5)
Out[62]: Array{Int64,2}
In [63]: ## A 2\times 3 matrix, where ; is used to separate rows
         a6 = [80 81 82 ; 90 91 92]
         typeof(a6)
Out [63]: Array{Int64,2}
In [64]: ## Arrays containing elements of a specific type can be constructed like:
         a7 = Float64[3.0 5.0 ; 1.1 3.5]
Out[64]: 2@2 Array{Float64,2}:
          3.0 5.0
          1.1 3.5
In [65]: ## Arrays can be explicitly created like this:
         Vector(undef,3)
```

Julia has many bulit-in functions that generate specific kinds of arrays. Here are some useful ones:

- zeros(T, d1, ..) is a d1-dimensional array of all zeros.
- ones(T, d1, ..) is a d1-dimensional array of all ones.
- rand(T, d1, ..): if T is Float a d1-dimensional array of random numbers between 0 and 1 is returned; if an array is specified as the first argument, d1 random elements from the array are returned.
- randn(T, d1, ..) is a d1-dimensional array of random numbers from the standard normal distribution with mean zero and standard deviation 1.
- MatrixT(I, (n,n)) is the  $n \times n$  identity matrix. The identity operator I is available in the 'LinearAlgebra.jl' package.
- fill! (A, x) is the array A filled with value x.

Note that, in the above, d1 can be a tuple specifying multiple dimensions.

Arrays can easily be concatenated in Julia. There are two functions commonly used to concatenate arrays:

- vcat (A1, A2, ...) concatenates arrays vertically, i.e., stacks A1 on top of A2.
- hcat(A1, A2, ...) concatenates arrays horizontally, i.e., adds A2 to the right of A1.

Of course, concatenations requires that the relevant dimensions match.

The following code blocks illustrates some useful array functions as we as slicing. Slicing for arrays works similarly to slicing for strings.

```
In [69]: ## return rando numbers between 0 and 1
        rand(2)
Out[69]: 2-element Array{Float64,1}:
          0.9011806932440589
          0.7846081397345164
In [70]: B = [80 81 82 ; 90 91 92]
Out[70]: 2@3 Array{Int64,2}:
          80 81 82
          90 91 92
In [71]: rand(B,2)
Out[71]: 2-element Array{Int64,1}:
          82
In [72]: ## The number of elements in B
         length(B)
Out[72]: 6
In [73]: ## The dimensions of B
        size(B)
Out[73]: (2, 3)
In [74]: ## the number of dimensions of B
         ndims(B)
Out[74]: 2
In [75]: ## A new array with the same elements (data) as B but different dimensions
         reshape(B, (3,2))
Out[75]: 3@2 Array{Int64,2}:
          80 91
          90 82
          81 92
In [76]: ndims(B)
Out[76]: 2
In [77]: ## A copy of B, where elements are recursively copied
        B2 = deepcopy(B)
Out[77]: 2E3 Array{Int64,2}:
          80 81 82
          90 91 92
```

```
In [78]: ## When slicing, a slice is specified for each dimension
         ## The first two rows of the first column done two ways
         B[1:2,]
Out[78]: 2-element Array{Int64,1}:
          80
          90
In [79]: B[1:2,1]
Out[79]: 2-element Array{Int64,1}:
          80
          90
In [80]: ## The first two rows of the second column
         B[1:2,2]
Out[80]: 2-element Array{Int64,1}:
          81
          91
In [81]: # The first row
         B[1,:]
Out[81]: 3-element Array{Int64,1}:
          80
          81
          82
In [82]: ## The third element
         B[3]
Out[82]: 81
In [83]: # Another way to build an array is using comprehensions
         A1 = [sqrt(i) \text{ for } i \text{ in } [16,25,64]]
Out[83]: 3-element Array{Float64,1}:
          4.0
          5.0
          8.0
In [84]: A2 = [i^2 \text{ for i in } [1,2,3]]
Out[84]: 3-element Array{Int64,1}:
          1
          4
          9
```

From a couple of examples in the above code block, we can see that Julia counts array elements by column, i.e., the kth element of the  $n \times m$  matrix X is the kth element of the nm-vector vec(X). Array comprehensions, illistrated above, are another more sophisticated way of building arrays. The generate the items in the array with a function and a loop. These items are then collected into an array by the brackets [] that surround the loop and function.

#### 1.4.2 Dictionaries

In Julia, dictionaries are defined as associative collections consisting of a key value pair, i.e., the key is associated with a specific value. These key-value pairs have their own type in Julia, Pairtypeof(Key), typeof(value) which creates a Pair object. Alternatively, the => symbol can be used to separate the key and value to create the same Pair object. One use of Pair objects is in the instantiation of dictionaries. Dictionaries in Julia can be used analogously to lists in R. Dictionaries are created using the keyword Pair object and types can be specified for both the key and the value. The keys are hashed and are always unique.

```
In [85]: ## Three dictionaries, DO is empty, D1 and D1 are the same
         D0 = Dict()
         D1 = Dict(1 => "red", 2 => "white")
         D2 = Dict{Integer, String}(1 => "red", 2 => "white")
         typeof(D2)
Out[85]: Dict{Integer,String}
In [86]: ## Dictionaries can be created using a loop
         food = ["salmon", "maple syrup", "touriere"]
         food_dict = Dict{Int, String}()
         ## keys are the foods index in the array
         for (n, fd) in enumerate(food)
             food_dict[n] = fd
         end
         food_dict
Out[86]: Dict{Int64,String} with 3 entries:
           2 => "maple syrup"
           3 => "touriere"
           1 => "salmon"
In [87]: ## Dictionaries can also be created using the generator syntax
         wine = ["red", "white", "rose"]
         wine_dict = Dict{Int, String}(i => wine[i] for i in 1:length(wine))
Out[87]: Dict{Int64,String} with 3 entries:
           2 => "white"
           3 => "rose"
           1 => "red"
```

Values can be accessed using [] with a value of dictionary key inserted between them or get(). The presence of a key can be checked using haskey() and a particular key can be accessed using getkey(). Keys can also be modified, as illustrated in the below code block. Here, we also demonstrate adding and deleting entries from a dictionary as well as various ways of manipulating keys and values. Note that the following code block builds on the previous.

```
Out[88]: "salmon"
In [89]: ## The qet() function can alos be used; note that "unknown" is
         ## the value returned here if the key is not in the dictionary
         get(food_dict,1,"unknown")
Out[89]: "salmon"
In [90]: get(food_dict,7,"unknown")
Out[90]: "unknown"
In [91]: ## we can also check directly for the presence of a particular key
         haskey(food_dict,2)
Out [91]: true
In [92]: haskey(food_dict,9)
Out [92]: false
In [93]: ## The getkey() function can also be used; note that 999 is the
         ## value returned here if the key is not in the dictionary
         getkey(food_dict,1,999)
Out[93]: 1
In [94]: ## A new value can be associated with an existing key
         food_dict[1]
         food_dict[1] = "lobster"
Out[94]: "lobster"
In [95]: ## Two common ways to add new entries:
         food dict[4] = "bannock"
         get!(food_dict,4,"miss")
         food_dict[5]
        KeyError: key 5 not found
        Stacktrace:
         [1] getindex(::Dict{Int64,String}, ::Int64) at .\dict.jl:478
         [2] top-level scope at In[95]:4
```

```
In [96]: ## The advantage of get!() is that will not add the new entry if
         ## a value is already associated with the key
         get!(food_dict,4,"fake")
Out[96]: "bannock"
In [97]: ## Just deleting entries by key is straightforward
         delete! (food dict,4)
Out[97]: Dict{Int64,String} with 3 entries:
           2 => "maple syrup"
           3 => "touriere"
           1 => "lobster"
In [98]: ## But we can also delete by key and return the value assocated with the key;
         ## note that 999 is reurned here if the key is not present
         deleted_fd_value = pop!(food_dict,3,999)
         food dict
Out[98]: Dict{Int64,String} with 2 entries:
           2 => "maple syrup"
           1 => "lobster"
In [99]: ## Keys can be coerced into arrays
         collect(keys(food_dict))
Out[99]: 2-element Array{Int64,1}:
          2
          1
In [100]: collect(values(food_dict))
Out[100]: 2-element Array{String,1}:
           "maple syrup"
           "lobster"
In [101]: ## We can also iterate over both keys and values
          for (k, v) in food_dict
              println("food_dict: key: ", k, "value: ", v)
          end
food_dict: key: 2value: maple syrup
food_dict: key: 1value: lobster
In [102]: ## We can also just loop over keys
          for k in keys(food dict)
              println("food_dict: keys: ",k)
          end
```

### 1.5 Control Flow

# 1.5.1 Compound Expressions

In Julia, a compound expression is one expression that is used to sequentially evalute a group of subexpressions. The value of the last subexpression is returned as the value of the expression. There area two to achieve this: Begin blocks and chains.

### 1.5.2 Conditional Evaluation

Conditional evaluation allows parts of a program to evaluated, or not, based on the value of a Boolean expression, i.e., an expression that produces a true/false value. In Julia, conditional evaluation takes the form of an if-elseif-else construct, which is evaluated until the first BOolean expression evaluates to true or the else statement is reached. When is given Boolean expression evaluates to true, the associated block of code executed. No other code blocks or condition expressions within the if-elseif-else construct returns the value of the last executed statement. Programmers can use as many elseif blocks as they wish, including none, i.e., an if-else construct. In Julia, if, elseif and else statements do not require parentheses; in fact, their use is discouraged.

An alternative approach to conditional evaluation is via shortcircuit evaluation. This construct has the form a ? b : c, where a is a Boolean expression, b is evaluated if a is true, and c is evaluated if a is false. Note that ? : is called the "ternary operator", it assocaites from right to left, and it can be useful for short conditional statements. Ternary operators cna be chained together to accommodate situations analogous to an if-elseif-else construct with one or more ifelse blocks.

Note that we do not use e in the above example because it is a literal in Julia (the exponential function); while it can be overwritten, it is best practice to avoid doing so.

```
In [110]: e
```

```
UndefVarError: e not defined
```

# Stacktrace:

```
[1] top-level scope at In[110]:1

In [111]: using Base.MathConstants
e

Out[111]: = 2.7182818284590...
```

# **1.5.3** Loops

Basics Two looping constructs exist in Julia: for loops and while loops. Theses loops can iterate over any container, such as a string or an array. The body of loop ends with the end keyword. Variables reference inside variables defined outside the body of the loop, pre-append them with the global keyword inside the body of the loop. A for loop can operate over a range object representing a sequence of number, e.g., 1:5, which it uses to get each index to loop through the range of values in the range, assigning each one to an indexing variable. THe indexing variable only exists inside the loop, when looping over a container, for loops can access the elements of the container directly using the in operator. Rather than using simple nesting, nested for loops can be written as a single outer loop with multiple indexing variables forming a Cartesian product, e.g., if there are two indexing variables then, for each value of the first index, each value of the second index is evaluated.

```
('J', 5)
('u', 5)
('1', 5)
('i', 5)
('a', 5)
In [115]: odd = [1,3,5]
          even = [2,4,6]
          for i in odd, j in even
              println("i*j: $(i*j)")
          end
i*j: 2
i*j: 4
i*j: 6
i*j: 6
i*j: 12
i*j: 18
i*j: 10
i*j: 20
i*j: 30
```

A while loop evaluates a conditional expression and, as long as it is true, the loop evaluates the code in the body of the loop. To ensure that the loop will end at some stage, an operation inside the loop has to falsify the conditional expression. Programmers must ensure that a while loop will falsify the conditional expression, otherwise the loop will become "infinity" and never finish executing.

```
In [116]: ## Example of an infinity while loop (nothing inside the loop can falsify
          ## the condition x<10)
          n=0
          x=1
          while x<10
              x=x+1
              print(10)
          end
101010101010101010
In [117]: ## A while loop to estimate the median using an MM algorithm
          using Distributions, Random
          Random.seed! (1234)
          iter = 0
          N = 100
          x = rand(Normal(2,1),N)
          psi = fill!(Vector{Float64}(undef,2),1e9)
```

```
while (true)
    global iter, x, psi
    iter += 1
    if iter == 25
        println("Max iteration reached at iter = $iter")
    end
    num, den = (0,0)
    ## elementwise operations in wgt
    wgt = (abs.(x .- psi[2])).^{-1}
    num = sum(wgt .* x)
    den = sum(wgt)
    psi = circshift(psi, 1)
    psi[2] = num/den
    dif = abs(psi[2]-psi[1])
    if dif < 0.001</pre>
        print("Converged at iteration $iter")
        break
    end
end
```

Converged at iteration 2

**Loop termination** When writing loops, it often advantageous to allow a loop to terminate early, before it has completed. In the case of a while loop, the loop would be broken before the test condition is falsified. when iterating over an iterable object with a for loop, it is stopped before the end of the object is reached. The break keyword can accomplish both tasks. The following code block has two loops, a while loop that calculates the square of the index variable and stops when the square is graeter than 16. Note that without the break keyword, this is an infinite loop. The second loop dose the same thing, but uses a for loop to do it. The for loop terminates before the end of the iterable range object is reached.

```
i: 2 --- sq: = 4
i: 3 --- sq: = 9
i: 4 --- sq: = 16
i: 5 --- sq: = 25
In [119]: for i = 1:10
              sq = i^2
              println("i: $i --- sq: $sq")
              if sq > 16
                  break
              end
          end
i: 1 --- sq: 1
i: 2 --- sq: 4
i: 3 --- sq: 9
i: 4 --- sq: 16
i: 5 --- sq: 25
```

In some situations, it might be the case that a programmer wants to move from the current iteration of a loop immediately into the next iteration before the current one is finished. This can be accomplished using the continue keyword.

In real world scenarios, continue could be used multiple times in a loop and there could be more complex code after the continue keyword.

**Exception handling** Exceptions are unexpected contions that can occur in a program while it is carrying out its computations. The program may not be able to carry out the required computations or return a sensible value to its caller. Usually, exceptions teminate the function or program that generates it and prints some sort of diagnostic message to standard output. An example of this is given in the following code block, where we try and take the logarithm of a negative number and the log() function throws an exception.

```
In [121]: ## generate an exception
          log(-1)
        DomainError with -1.0:
    log will only return a complex result if called with a complex argument. Try log(Complex(x
        Stacktrace:
         [1] throw_complex_domainerror(::Symbol, ::Float64) at .\math.jl:31
         [2] log(::Float64) at .\special\log.jl:285
         [3] log(::Int64) at .\special\log.j1:395
         [4] top-level scope at In[121]:1
   In the above code block the log() function threw a DomainError exception. Julia has a num-
ber of built-in exceptions that can be thrown captured by Julia program. Any exception can be
explicitly thrown using throw() function.
In [122]: ## throw()
          for i in [1,2,-1,3]
              if i < 0
                  throw(DomainError())
              else
                  println("i:$(log(i))")
              end
          end
i:0.0
i:0.6931471805599453
        MethodError: no method matching DomainError()
    Closest candidates are:
      DomainError(!Matched::Any) at boot.jl:256
      DomainError(!Matched::Any, !Matched::Any) at boot.jl:257
        Stacktrace:
```

[1] top-level scope at .\In[122]:4

In the previous code block, we throw the DomainError() exception when the input to log() is negative. Note that DomainError() requires the bracket () to return an exception object of type ErrorException that will immediately stop all execution of the Julia program.

If we want to test for an excepiton and handle it gracefully, we can use a try-each statment to do this. These statements allow us to catch an exception, store it in a variable if required, and try an alternative way of processing the input that generated the exception.

```
In [124]: ## try/catch
          for i in [1,2,-1,"A"]
              try log(i)
              catch ex
                  if isa(ex, DomainError)
                       println("i: $i --- Domain Error")
                       log(abs(i))
                  else
                       println("i: $i")
                      println(ex)
                       error("Not a DomainError")
                  end
              end
          end
i: -1 --- Domain Error
i: A
```

```
MethodError(log, ("A",), 0x00000000000000641c)

Not a DomainError

Stacktrace:

[1] error(::String) at .\error.jl:33
```

[2] top-level scope at .\In[124]:11

In the previous code block, the exception is stored in the ex variable and when the error is not a DomainError(), its value is returned along with the ErrorException defined by the call to error(). Note that try-catch blocks can degrade the preformance code, it is better to use standard conditional evaluation to handle known exceptions.

### 1.6 Functions

A function is an object that takes argument values as a tuple and maps them to return value. Functions are first-class objects in Julia. They can be:

- assigned to variables;
- called from these variables;
- passed as arguments to other functions;
- returned a syalues from a function.

A first-class object is one that accommodates all operations other objects support. Operations typically supported by first-class bojects in all programming languages are listed above. The basic syntax of a function is illustrated in the following code block.

In Julia, function names are all lowercase, without underscores, but can include Unicode charaters. It is best practice to avoid abbreviations, e.g., fibonacci() is preferable to fib(). The body of the function is the part contained on the line between the function and end keywords. Parenthesis syntax is used to call a function, e.g. add(3,5) returns 8. Because functions are objects, they can be passed around like any value and, when passed, the parentheses are omitted.

Functions may also be written in assignment form, in which case the body of the function must be a single expression. This can be a very useful approach for simple functions because it makes code mych easier to read.

```
In [127]: add2(x,y) = x+y
Out[127]: add2 (generic function with 1 method)
```

Argument passing is done by reference. Modeifications to the input data structure (e.g., array) inside the function will be visible outside it. If function inputs are not to be modified by a function, a copy of the input(s) should be made inside the functino before doing any modification. *Python* and other dynamic languages handle their functino arguments in a similar way.

By default, the last expression that is evaluated in the body of a function is its reutrn value. However, when the function body contains one or more return keywords, it returns immdiately when a return keyword is evaluated. The return keywird usually wraps an expression that provides a value when returned. When used with the control flow statements, the return keyword can be especially useful.

```
In [130]: ## A function with multiple option for return
    function gt(g1, g2)
        if (g1 > g2)
            return("$g1 is largest")
        elseif (g1 < g2)
            return ("$g2 is largest")
        else
            return("$g1 and $g2 are equal")
        end
    end
end</pre>
```

```
Out[130]: "5 is largest"
```

The majority of Julia operators are actually functions and can be called with parenthesized argument lists, just like other functions.

Functions can also be created without a name, and such functions are called anonymous functions. Anonymous functions can be used as arguments for functions that take other functions as arguments.

Julia accommodates optional arguments by allowing funtion arguments to have default values, similar to *R* and many other languages. The value of an optional arguments dose not need to be specified in a function call.

```
## sum the first 12 elements of the Fibonacci sequence
fibonacci(12)

Out[135]: 233
In [136]: fibonacci()

Out[136]: 10946
In [137]: fibonacci(20)
Out[137]: 10946
```

Function arguments determine its behaviour. In general, the more arguments a funtino has, the more varied its behaviour will be. Keyword arguments are useful because they help manage function behaviour; specifically, they allow arguments to be specified by name and not just position in the function call. In the below code block, an MM algorithm is demonstrated. Note that we have already used MM algorithm, but now we construct an MM algorithm as a functino. MM algorithms are blueprints for algorithms that eiger iteratively minimize a majorizing function or iteratively maximize a minorizing function -- see Hunter and Lange (2000,2004) for further details.

```
In [1]: ## A function with a keyword argument
        ## Argument after the ; are keyword argumennts
        ## The default values are evaluated from left-to-right
        ## This allows keyword arguments to refer previously defined keywords
        ## Keyword arguments can have explicit types
        ## estimate the median of a 1D array using an MM algorithm
        ## for clarity (too many m's!) we use an _ in the function name
        function mm_median(x,eps=0.001;maxit=25, iter::Int64=Int(floor(eps)))
            ## initalizations
            psi = fill!(Vector{Float64}(undef,2),1e2)
            while(true)
                iter += 1
                if iter == maxit
                    println("Max iteration reached at iter=$iter")
                    break
                end
                num, den = (0,0)
                ## use map() to do elementwise operations in wqt
                wgt = map(d \rightarrow (abs(d - psi[2]))^(-1),x)
                num = sum(map(*,wgt,x))
                den = sum(wgt)
                psi = circshift(psi,1)
```

```
psi[2] = num/den
                dif = abs(psi[2]-psi[1])
                if dif < eps
                    print("Converged at iteration $iter")
                    break
                end
            end
            return(Dict(
                    "psi_vec"=> psi,
                    "median"=> psi[2]
        end
        ## Run on simulated data
        using Distributions, Random
        Random.seed! (1234)
        N = Int(1e3)
        dat = rand(Normal(0,6),N)
        ## function calls using different types of arguments
        median(dat)
Out[1]: -0.2880149883794124
In [2]: mm_median(dat, 1e-9)["median"]
Max iteration reached at iter=25
Out[2]: -0.2327764134562274
In [3]: mm_median(dat, maxit=50)["median"]
Converged at iteration 21
Out[3]: -0.21952663270908485
In [4]: mm_median(dat, 1e-9,maxit=100)["median"]
Converged at iteration 44
Out[4]: -0.2812122997253034
```

Some general tips for using functions are as follows:

1. Write programs as a series of functions because: functions are testable and reusable, they have well-defined inputs and outputs, and code inside funtions usually runs much faster because of how the Julia compiler works.

- 2. Functions should not operate on global variables.
- 3. Functions with! at the end of their names modify their auguments instead of copying them. Julia library functions often come in two versions, distinguished by the!.
- 4. Pass a function directly, do not wrap it in anonymous function.
- 5. When writing functions that take numbers as arguments, usethe Int type when possible. When combined in numerical computations, they change the resulting Julia type of the result less frequently. This is known as type promotion.
- 6. If functino arguments have specific types, the functino call should force its arguments to the required type.

The aforementioned tips are illustrated in the following code block.

```
In [5]: ## Tip3: functino with a `!` in the name
        a1 = [2,3,1,6,2,8]
        sort!(a1)
        a1
Out[5]: 6-element Array{Int64,1}:
         1
         2
         2
         3
         6
         8
In [6]: ## Tip4: Don't warp abs() in an anonymous function
        A = [1, -0.5, -2, 0.5]
        map(x \rightarrow abs(x), A)
Out[6]: 4-element Array{Float64,1}:
         1.0
         0.5
         2.0
         0.5
In [7]: ## Rather, do this
        ## abs() is not wrapped in an anonymous functino
        map(abs, A)
Out[7]: 4-element Array{Float64,1}:
         1.0
         0.5
         2.0
         0.5
In [12]: ##Tip5: Type promotion
         times1a(y) = *(y,1)
         times1b(y) = *(y, 1.0)
         println("times1a(1/2): ",times1a(1/2))
```