## Julia Syntax and Algorithm

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# THE MOST important coding rules

# Leggi le leggi

("Read the manuals" in Italian)

Syntax & Algorithm

### Resources on Syntax

- Julia Official Tutorial: https://julialang.org/learning/tutorials/
- Wikibook on Introducing Julia: https://en.wikibooks.org/wiki/Introducing\_Julia
- QuantEcon w/ Julia: https://julia.quantecon.org/intro.html
- Julia in 100 Seconds: https://www.youtube.com/watch?v=JYs\_94znYy0

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#### The REPL

REPL stands for **R**ead, **E**valuate, **P**rint, and **L**oops. Julia's REPL is the best I have ever seen, includes

- lacktriangle Unicode transformation: type \alpha and tab leads to lpha
- Package management: type ] to enter Pkg mode to add packages
- Manual query: type ? to enter help mode & find function manual
- Tab completion: type \al and tab gives you possible commands
- $\blacksquare \uparrow / \downarrow$ : up/down arrow key cycle through executed command history

# The Language: Good and Bad

Julia language is designed with scientific computing in mind, and thus

- lacktriangle Unicode variable: directly use lpha as variable, not alpha.
- Multiple dispatch: multiple "methods" in one function for input types
- Type system: use struct to build custom types ( $\approx$  but  $\neq$  OOP)

But also have some weird behavior that I am not used to:

- Weird scope: variables defined inside loops ( while , for ) are local.
- Speed needs discipline: well-written code v.s. sloppy-written code
- Memory usage: might directly crash the Julia session (∵ LLVM?)

Best practice? Still Searching...

### Syntax: generating a grid

- Usually the Macro coding starts with the grids of choice variables.
- A grid is a finite sample of continuous choice variable.
- Key to construct a grid is the collect and range function.
- range syntax requires start pt, stop pt and length of this grid
- collect then "collect" this range object into an array.

```
cnum = 100
lnum = 100
cgrid = collect( range( 0.01, 10.0, length = cnum ) )
lgrid = collect( range( 0.01, 1.0, length = lnum ) )
```

# Syntax: Array manipulation

To get one element of a grid, we use [] syntax.

```
cval = cgrid[1] # get the first element of cgrid
lval = lgrid[5] # get the fifth element of lgrid
```

To create an array, you can use manual or automatical way.

```
# manually type all the elements
a = [1.0, 2.0, 3.0, 4.0, 5.0]
# automatically generate an "empty" array
# type dim empty row column
utility = Array{Float64, 2}(undef, cnum, lnum)
utility = zeros(cnum, lnum) # zero array
utility = ones(cnum, lnum) # one array
```

# Syntax: for loop

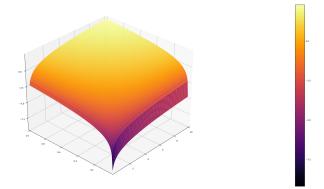
To calculate the utility value at each (C,l) bundle, use for loop

```
utility = Array{Float64, 2}(undef, cnum, lnum)
for indl in 1:1:1num
    # get the each value in leisure grid
    lval = lgrid[indl]
    for indc in 1:1:cnum
        # get the each value in consumption grid
        cval = cgrid[indc]
        # log utility in both c and l
        utility[indc, indl] = log(cval) + log(lval)
    end
end
```

## Syntax: 3-D plotting

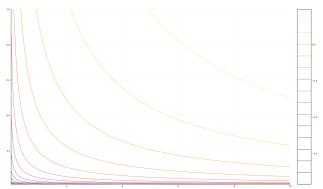
Install Plots and PyPlot by typing ] and type add Plots PyPlot Plot the utility array by

```
using Plots; pyplot();
surface(cgrid, lgrid, utility) # 3-D figure
```



# Syntax: contour plotting

```
using Plots; pyplot();
contour(cgrid, lgrid, utility) # contour figure
```



# Syntax: println print something out

To show some info inside the for loop, println is a convenient tool. If you want to know what (C,l) bundle leads to U(C,l)=0.0,

```
for indl in 1:1:lnum
    for indc in 1:1:cnum
        # the abs of u is close enough to 0.0
        if abs(utility[indc, indl]) < 1e-2</pre>
        # '$': string interpolation (IMO inefficient)
             println("U \sim 0 at (C, 1) = (\$indc, \$indl)")
        end
    end
end
```

println v.s. print: println add additional \n

## Syntax: while loop

while loop mostly used when iteration only hault in some conditions. In my experience it is mostly used if something needs convergence.

The following code is **NOT** an efficient way to find minimum location.

(should use argmin for minimum and argmax for maximum)

```
dist = 1.0; iter = 0;
while (dist > 1e-2)
    iter += 1 # same as "iter = iter + 1"
    indc = rand(1:1:cnum); indl = rand(1:1:lnum)
    dist = utility[indc, indl] - minimum(utility)
    if (dist < 1e-2)
        println("Find minimum at ($indc, $indl)")
        println("Iterates $iter times")
    end
```

## Syntax: Rounding

Mostly for exam / standardization purpose.

```
round(pi)  # 3.0
round(pi, digits = 1) # 3.1
round(pi, digits = 2) # 3.14
round(pi, digits = 3) # 3.142
round(pi, digits = 4) # 3.1416
round(pi, digits = 5) # 3.14159
```

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#### Application: Laffer curve

There are going to be two applications for Julia syntax learned:

- 1 Laffer curve in distorting taxes, and
- ② Government spending in CRRA utility function.

Recall that  $Y=zN^d$  implies labor supply  $N^s(t)$  equals to

$$N^{s}(t) = 1 - l = \frac{1}{2} - \frac{\pi}{2(1-t)},\tag{1}$$

and the total tax revenue is given by

$$R(t) = wtN^s(t). (2)$$

In equilibrium w=z=1, so  $\pi=zN^d-wN^d=0$ , so this question is trivial...

# Laffer curve in Cobb-Douglas Production Function

Assume  $Y=zN^a$ , where a<1, so firm's problem leads to

$$w(N) = MPN = zaN^{a-1}, (3)$$

$$\pi(N) = Y - wN = z(1 - a)N^{a},\tag{4}$$

and recall  $MRS_{l,C} = w(1-t)$  and binding BC  $C = w(1-t)N + \pi$ , so

$$MRS_{l,C} = \frac{C}{l} = \frac{w(1-t)N + \pi}{l} = w(1-t)$$
 (5)

$$=\frac{w(N)(1-t)N+\pi(N)}{(1-N)}=w(N)(1-t)$$
 (6)

expands, we get a monster:

$$\frac{zaN^{a-1}(1-t)N + z(1-a)N^a}{1-N} = zaN^{a-1}(1-t)$$
 (7)

# Laffer curve in Cobb-Douglas Production Function (cont.)

But not too bad, because you realize:

Common 
$$N: \frac{zaN^{a-1}(1-t)N + z(1-a)N^a}{1-N} = zaN^{a-1}(1-t)$$
 (8)

Common 
$$zN^a$$
: 
$$\frac{zaN^a(1-t) + z(1-a)N^a}{1-N} = zaN^{a-1}(1-t)$$
 (9)

Erase 
$$zN^{a-1}$$
: 
$$\frac{zN^a[a(1-t)+1-a]}{1-N} = za(1-t)N^{a-1}$$
 (10)

Divide 
$$[\cdot]: \frac{N[a(1-t)+1-a]}{1-N} = a(1-t)$$
 (11)

$$\frac{N}{1-N} = \frac{a(1-t)}{a(1-t)+1-a} \equiv A(t) \tag{12}$$

$$N = A(1 - N) = A - AN (13)$$

$$(1+A)N = A \Rightarrow N(t) = \frac{A(t)}{1+A(t)}$$
 (14)

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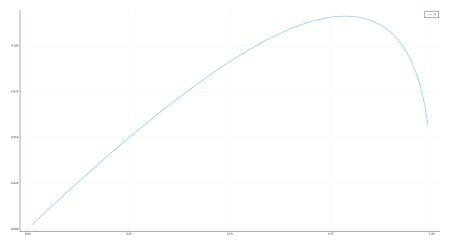
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#### Laffer curve in Julia

```
a = 0.33; tnum = 1000
tgrid = collect( range(0.01, 0.99, length = tnum) )
Gvec = Array{Float64, 1}(undef, tnum)
for indt = 1:1:tnum
    t = tgrid[indt]
    A = (a*(1-t)) / (a*(1-t) + 1 - a)
    N = A / (1 + A)
    w = a*N^{(a-1)}
    Gvec[indt] = w * t * N
end
Gmax = maximum(Gvec); tmax = tgrid[argmax(Gvec)];
println("G* = $Gmax; t* = $tmax")
```

# Laffer curve in Julia (cont.)

```
using Plots; pyplot()
plot(tgrid, Gvec, label = "G")
```



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#### Grid search

Just calculate value **on** the grid points! Like for loop slide Recall the formula with gov spending:

$$\max_{l} \quad \frac{(z(1-l)^{1-\alpha} - G)^{1-b}}{1-b} + \frac{l^{1-d}}{1-d}. \tag{15}$$

We want to solve l(z,G), but how to choose the  $\operatorname{Ggrid}$ ? From the FOC we know

$$G = F(l) = z(1-l)^{1-\alpha} - \left[\frac{l^{-d}}{(1-\alpha)z(1-l)^{-\alpha}}\right]^{-\frac{1}{b}}.$$
 (16)

Our first step starts with generating a TFP grid:

### Grid search: preperation

We want to find the upper/lower bound of Ggrid:

```
a = 1/2: b = 2: d = 3/2:
GovFOC(z, 1) = z*(1-1)^(1-a) - \# line continuation!
    ((1^{-1})) / ((1-a)*z*(1-1)^{-1})
# upper & lower bound of Ggrid
Gbound = Array{Float64, 2}(undef, znum, 2)
for indz = 1:1:znum
    zval = zgrid[indz]
    Gbound[indz, 1] = GovFOC(zval, 0.99) # lower bound
    Gbound[indz, 2] = GovFOC(zval, 0.01) # upper bound
end
```

# Grid search: preperation (cont.)

```
# lower bound should higher than 0.01
Glow = max(0.0, minimum(Gbound))
Ghigh = maximum(Gbound)
# build Ggrid
Gnum = 100
Ggrid = collect( range( Glow, Ghigh, length = Gnum ) )
# build lgrid
lnum = 100
lgrid = collect( range( 0.01, 1.0, length = lnum ) )
```

and then find the optimal leisure using the value on this grid:

#### Grid search: structure

```
a = 1/2; b = 2; d = 3/2;
# define implicit utility function
utility(1, z, G) = ((z*(1-1)^(1-a) - G)^(1-b))
                    (1-b) +
                    (1^{(1-d)}) / (1-d)
# Array for storage
## for temporary storage
uvec = Array{Float64, 1}(undef, lnum)
## for optimal utility value
ustar = Array{Float64, 2}(undef, znum, Gnum)
## for optimal leisure given z, G
lstar = Array{Float64, 2}(undef, znum, Gnum)
```

# Grid search: structure (cont.)

```
for indG = 1:1:Gnum
    Gval = Ggrid[indG]
    for indz = 1:1:znum
        zval = zgrid[indz]
        for indl = 1:1:lnum
            lval = lgrid[indl]
            cval = zval*(1-lval)^(1-a) - Gval
            uvec[indl] = (cval < 0.0 ? -Inf :
                            utility(lval, zval, Gval) )
        end
        ustar[indz, indG] = maximum(uvec)
    end
end
```

# Grid search: analysis

Notice that in previous slide, I check whether  $[\mathtt{cval} < 0.0]$  and also we find the highest utility and the corresponding (z,G) value by

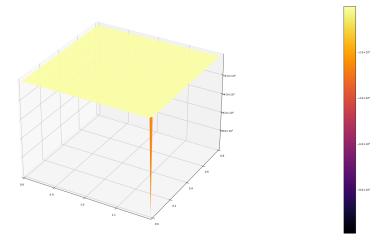
```
umax = maximum(ustar)
zloc = argmax(ustar)[1]
Gloc = argmax(ustar)[2]
zmax = zgrid[zloc]
Gmax = Ggrid[Gloc]
```

But if you plot you will see that the plot is slightly "off":

```
using Plots; pyplot()
surface(zgrid, Ggrid, ustar)
```

: large negative point that drag down the scale of every point.

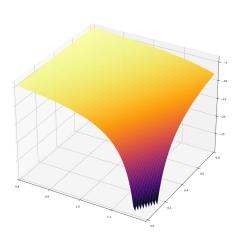
# grid search: misleading figure



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# Grid search: revising (erase uval < -30.0)

```
for indG = 1:1:Gnum
    Gval = Ggrid[indG]
    for indz = 1:1:znum
        zval = zgrid[indz]
        for indl = 1:1:lnum
            lval = lgrid[indl]
            cval = zval*(1-lval)^(1-a) - Gval
            uval = utility(lval, zval, Gval)
            uvec[indl] = ((cval < 0.0 | uval < -30.0)
                            ? -Inf : uval )
        end
        ustar[indz. indG] = maximum(uvec)
    end
```



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#### Grid search: Can we do better?

All of the  $-\mbox{Inf}$  stuff we are assigning manually is because C<0.

Recall that C=Y-G, and thus for  $C\geq 0$ ,  $Y-G\geq 0 \Rightarrow Y>G$ .

```
ymat = Array{Float64, 2}(undef, znum, lnum)
for indl = 1:1:lnum
    lval = lgrid[indl]
    for indz = 1:1:znum
        zval = zgrid[indz]
        ymat[indz, indl] = zval * (1-lval)^(1-a)
    end
end
ymin = minimum(ymat)
```

You will get min(y) = 0.081, which means that if you choose the Ghigh = 0.08,  $C > 0, \forall z, G$  assigned.

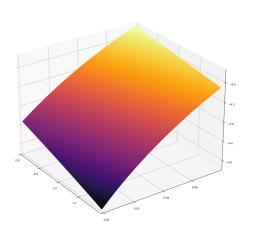
#### Grid search: do better

```
# lower bound should higher than 0.01
Glow = 0.0
Ghigh = 0.08
# build Ggrid
Gnum = 100
Ggrid = collect( range( Glow, Ghigh, length = Gnum ) )
# build lgrid
lnum = 100
lgrid = collect( range( 0.01, 0.99, length = lnum ) )
```

and then find the optimal leisure using the value on this grid:

# Grid search: do better (cont.)

```
for indG = 1:1:Gnum
    Gval = Ggrid[indG]
    for indz = 1:1:znum
        zval = zgrid[indz]
        for indl = 1:1:lnum
            lval = lgrid[indl]
            cval = zval*(1-lval)^(1-a) - Gval
            uvec[indl] = utility(lval, zval, Gval)
        end
        ustar[indz, indG] = maximum(uvec)
    end
end
```





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#### Grid search method: additional details

Calculate on the grid point  $\Rightarrow$  result are correct but speed is slow. Notice that when you choose the grid points, better to avoid some value:

#### Example

When I create cgrid and lgrid, I avoid the start point of 0.0, but 0.01, since  $log(0.0) = \infty$ .

In general, if theoretical range, say leisure, is [0,1], then it is safe to build a grid from [0.01,0.99].