# CT561: Systems Modelling and Simulation

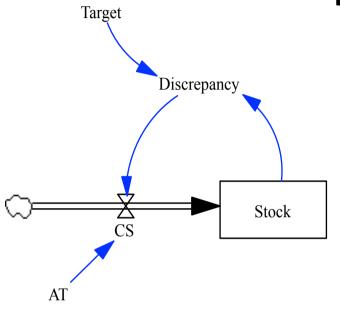
# Week 8: Effects and Limits to Growth

https://github.com/JimDuggan/CT561

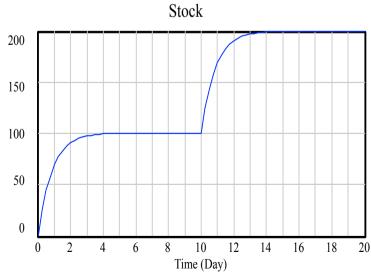
Dr. Jim Duggan,
Information Technology,
School of Engineering & Informatics



# Recap – deSolve



- (01) AT= 1
- (02) CS= Discrepancy/AT
- (03) Discrepancy=Target-Stock
- (04) Stock= INTEG (CS, 0)
- (05) Target = 100 + step(100,10)



Stock : Current

### Setting up key variables

```
library(deSolve)
library(ggplot2)
START<-0; FINISH<-20; STEP<-0.25;
simtime <- seq(START, FINISH, by=STEP)</pre>
# Setup the step function in a global data frame
target <- rep(NA,length(simtime))</pre>
target[1:(10/STEP)]<-100
target[((10/STEP)+1):length(simtime)]<-200
simData<-data.frame(time=simtime, aTarget=target)</pre>
```

### Simulating the step function...

```
> simData[seq(1,80,by=8),]
   time aTarget
      0
             100
1
9
            100
            100
17
25 6
            100
33
            100
41
     10
            200
     12
            200
49
57
     14
            200
     16
65
             200
73
     18
            200
```

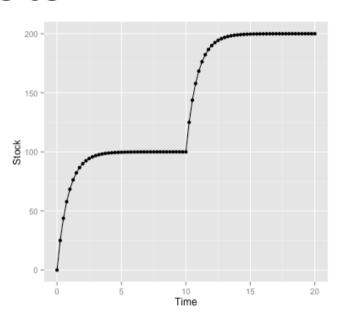
#### The model

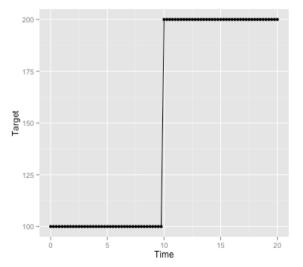
```
model <- function(time, stocks, auxs)</pre>
  {
    with(as.list(c(stocks, auxs)),{
      index<-which(simData$time==time)</pre>
      aDisrepancy<-simData$aTarget[index] - sStock
      fRI<- aDisrepancy/ aAT
      dS_dt <- fRI
      return (list(c(dS_dt),
                   Target=simData$aTarget[index],
                   Inflow=fRI,
                   AT=aAT))
})
```

### Running the simulation...

#### **Data and Plots**

#### > o[seq(1,80,by=8),]sStock Target Inflow AT time 0 0.00000 100 100.00000000 9 89.98871 100 10.01129150 17 98.99774 100 1.00225958 25 0.10033913 99.89966 100 33 99.98995 100 0.01004524 41 200 100.00100566 10 99.99899 49 12 189.98861 200 10.01139218 57 1.00226966 14 198.99773 200 0.10034014 65 16 199.89966 200 73 18 199.98995 0.01004534 200





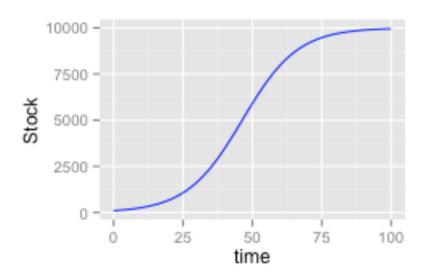
#### Overview

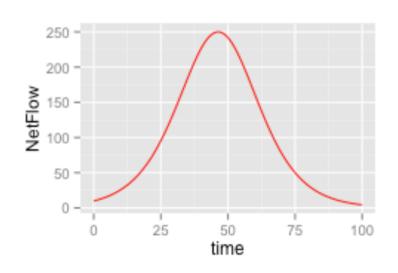
There will always be limits to growth.

They can be self-imposed.

If they aren't, they will be system-imposed.

Donella H. Meadows, Thinking in Systems: A Primer (2008), p.103





### Formulating Effects

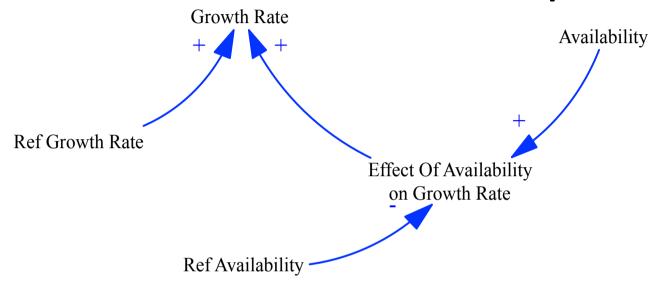
- An important building block for system dynamics modeling is to capture how variables influence one another over time.
- While some of these may be simple linear relationships, the reality is that real-world effects between variables can also be non-linear, and may also involve multiple variables.
- System dynamics offers a convenient structure for modeling effect variables (Sterman 2000).

$$Y = Y^* \times Effect(X_1 on Y) \times ... \times Effect(X_n on Y)$$
 (4-1)

$$Effect (X_i on Y) = \frac{X_i}{X_i^*}$$
 (4-2)

- There is a variable Y that is the dependent variable of a causal relationship, and this depends on a set of n independent variables  $(X_1, X_2, ..., X_n)$
- The variable Y has a reference value  $Y^*$ , and this is multiplied by a sequence of effect functions that are calculated based on the normalized ratio of  $(X_i/X_i^*)$ , where  $X_i^*$  is the reference value, and  $X_i$  is the actual value.
- The effect function (y-axis) has the normalized ratio  $(X/X^*)$  on its x-axis, and always contains the point (1,1) although the function itself can be either linear or non-linear around this point.
- This point (1,1) is important for the following reason: if X equals its reference value X\*, then the effect function will be 1, and therefore Y will then equal its reference value Y\* (from equation 4-1).

#### **Growth Rate Example**



Growth Rate = Ref Growth Rate 
$$\times$$
 Effect of Availability on Growth Rate

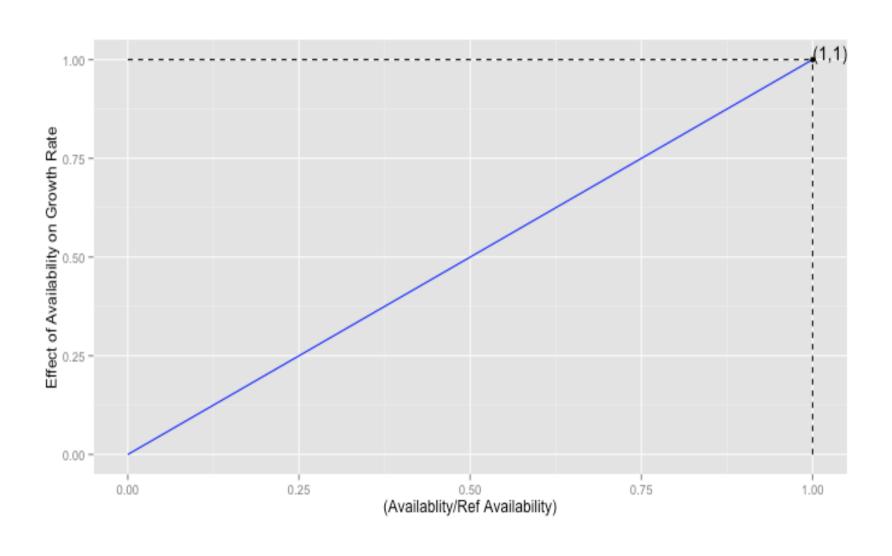
Effect of Availability on Growth Rate =  $f(\frac{Availability}{Ref Availability})$  (4-4)

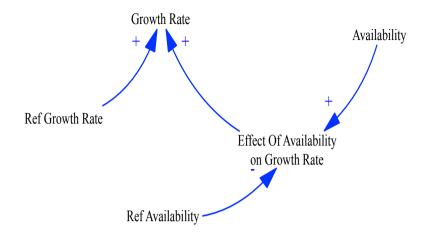
Ref Growth Rate = 0.10 (4-5)

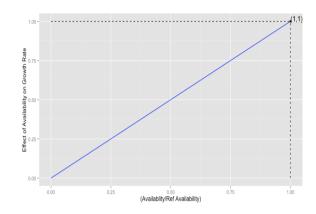
Ref Availability = 1.0 (4-6)

The system grows at a rate of 10% if the availability stays at 1.0

# Effect equation y = mx + c



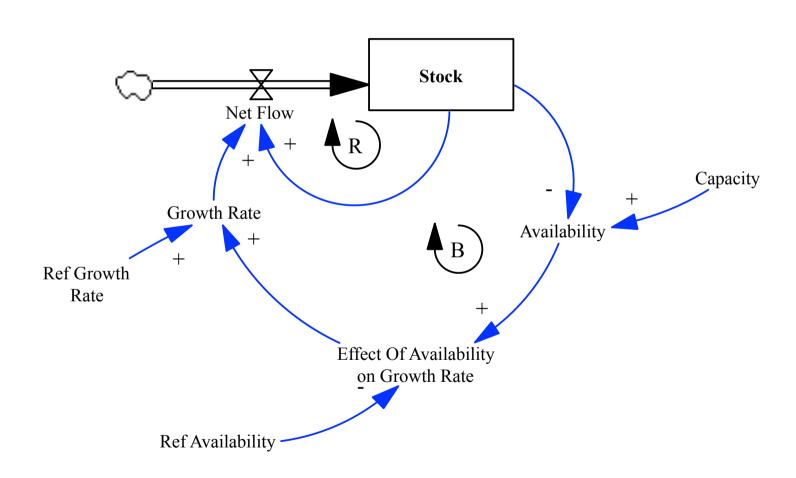




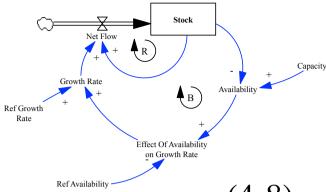
 $Effect of Availability on Growth Rate = \frac{Availability}{Ref Availability}$ (4-7)

	Ref Availability	Availability	Effect of Availability on Growth Rate	Ref Growth Rate	Growth Rate
	1.0	1.0	1.0	0.10	0.10
Г	1.0	0.5	0.5	0.10	0.05
	1.0	0.0	0.0	0.10	0.00

# Model of S-Shaped Growth



### **Equations**



 $Stock = INTEGRAL(Net\ Flow, 100)$ 

 $Net\ Flow = Stock \times Growth\ Rate$ 

$$Availability = 1 - \frac{Stock}{Capacity}$$

$$Capacity = 10000$$

(4-8)

(4-9)

(4-10)

(4-11)

 $Effect of Availability on Growth Rate = \frac{Availability}{Ref Availability}$ (4-7)

$$Growth Rate = Ref Growth Rate$$
 (4-3)

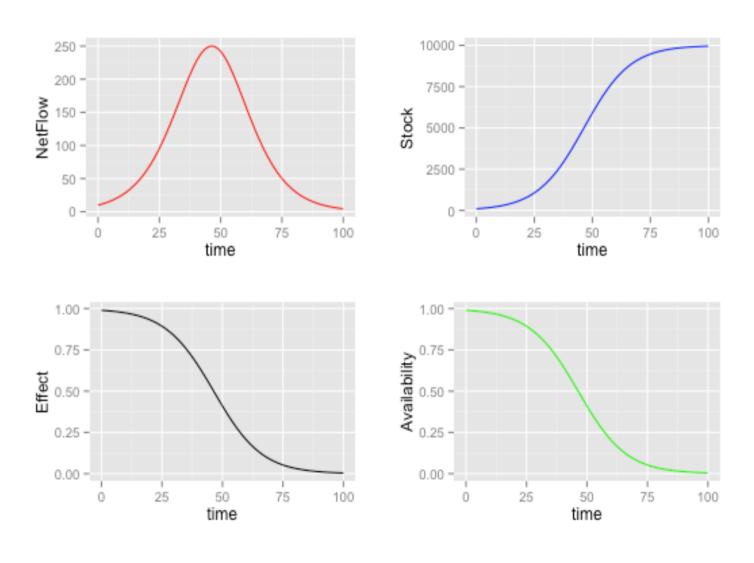
 $\times$  Effect of Availability on Growth Rate

Effect of Availability on Growth Rate = 
$$f(\frac{Availability}{Ref Availability})$$
 (4-4)

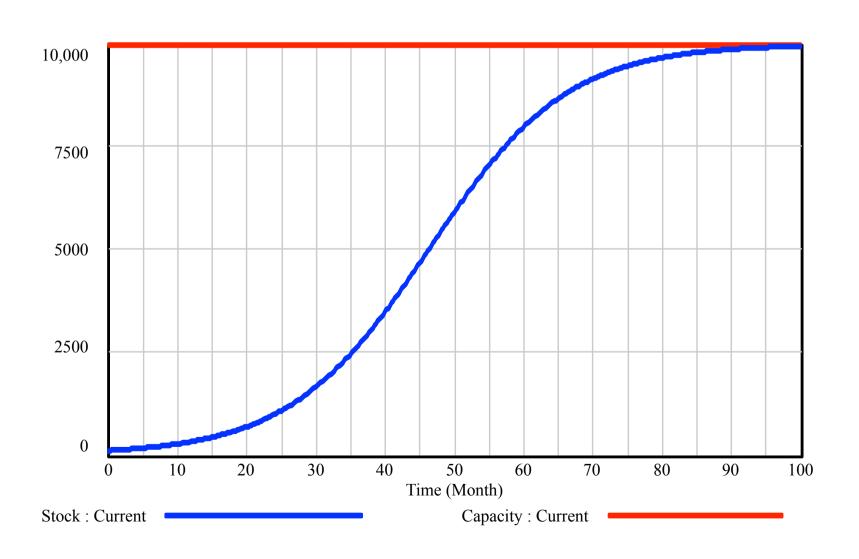
$$Ref\ Growth\ Rate = 0.10$$
 (4-5)

$$Ref Availability = 1.0$$
 (4-6)

# **Simulation Output**



# Limit constant, stock approaches



### Verhulst Equations (1838)

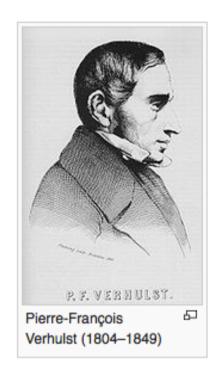
#### In ecology: modeling population growth [edit]

A typical application of the logistic equation is a common model of population growth, originally due to Pierre-François Verhulst in 1838, where the rate of reproduction is proportional to both the existing population and the amount of available resources, all else being equal. The Verhulst equation was published after Verhulst had read Thomas Malthus' *An Essay on the Principle of Population*. Verhulst derived his logistic equation to describe the self-limiting growth of a biological population. The equation was rediscovered in 1911 by A. G. McKendrick for the growth of bacteria in broth and experimentally tested using a technique for nonlinear parameter estimation.<sup>[4]</sup> The equation is also sometimes called the *Verhulst-Pearl equation* following its rediscovery in 1920 by Raymond Pearl (1879–1940) and Lowell Reed (1888–1966) of the Johns Hopkins University.<sup>[5]</sup> Another scientist, Alfred J. Lotka derived the equation again in 1925, calling it the *law of population growth*.

Letting *P* represent population size (*N* is often used in ecology instead) and *t* represent time, this model is formalized by the differential equation:

$$\frac{dP}{dt} = rP \cdot \left(1 - \frac{P}{K}\right)$$

where the constant r defines the growth rate and K is the carrying capacity.



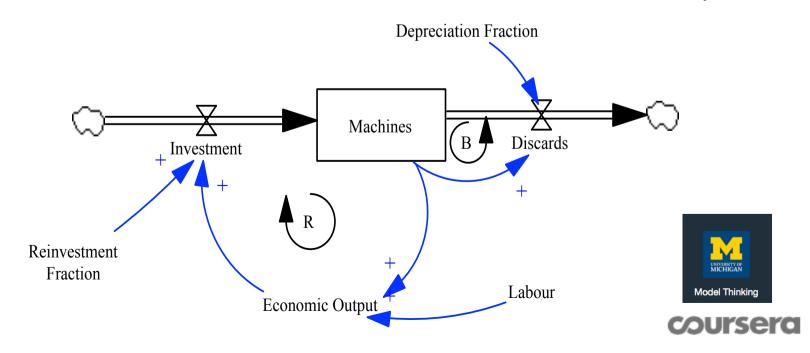
https://en.wikipedia.org/wiki/Logistic function

#### Challenge 8.1

- Consider a software development team
- It contains:
  - Experienced Engineering
  - Rookie Engineers
- The normal productivity of experienced engineering is 200 LOC/Day, and this occurs when the Rookie percentage is 20%
- Construct an effects equation to model this, explain any assumptions made.

#### Model of Economic Growth

- In presenting the model, Page (2015) imagines a scenario where a self-contained civilization supports itself through harvesting coconuts using machines.
- A percentage of these resources can be reinvested to produce more machines, and therefore increase the economic output.



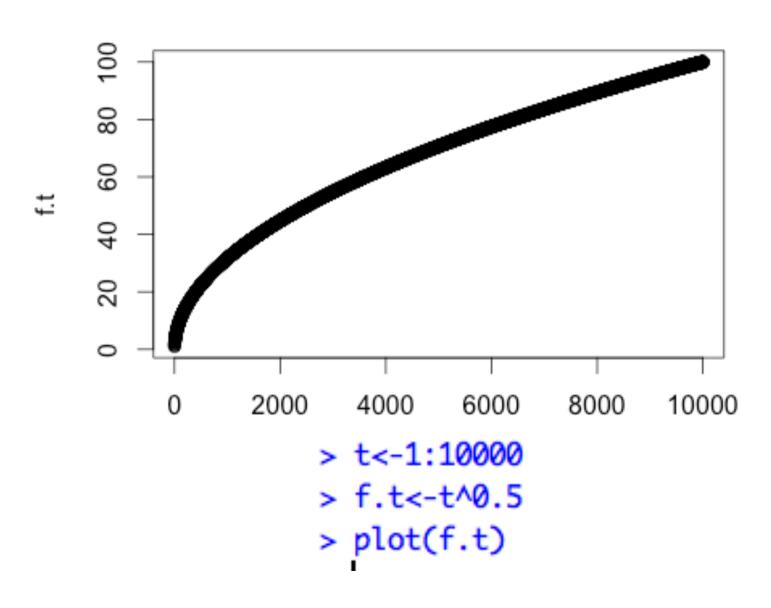
#### Equations

$$Machines (M) = INTEGRAL(Investment - Disards, 100)$$
 (4-12)  
 $Investment = Economic Output \times Reinvestment Fraction$  (4-13)  
 $Discards = Machines \times Depreciation Fraction$  (4-14)  
 $Reinvestement Fraction (R) = 0.20$  (4-15)  
 $Depreciation Fraction(D) = 0.10$  (4-16)

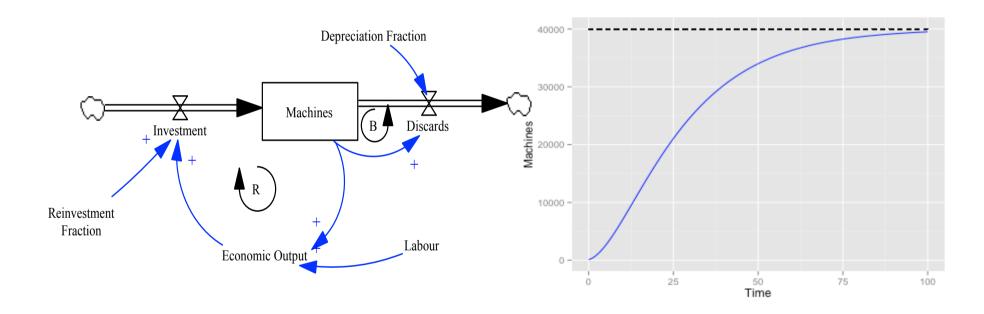
Economic Output(0) = Labour 
$$\times \sqrt{Machines}$$
 (4-17)  
Labour (L) = 100 (4-18)

Economic output is based on the laws of diminishing returns (concave function)

#### **Concave Function**



# **Simulation Output**



#### Model based on...

#### A CONTRIBUTION TO THE THEORY OF ECONOMIC GROWTH

#### By Robert M. Solow

I. Introduction, 65. — II. A model of long-run growth, 66. — III. Possible growth patterns, 68. — IV. Examples, 73. — V. Behavior of interest and wage rates, 78. — VI. Extensions, 85. — VII. Qualifications, 91.

#### I. Introduction

All theory depends on assumptions which are not quite true. That is what makes it theory. The art of successful theorizing is to make the inevitable simplifying assumptions in such a way that the final results are not very sensitive. A "crucial" assumption is one on which the conclusions do depend sensitively, and it is important that crucial assumptions be reasonably realistic. When the results of a theory seem to flow specifically from a special crucial assumption, then if the assumption is dubious, the results are suspect.

### Challenge

- Find the steady state (equilibrium) value for the number of machines, given that the following values are known:
  - Reinvestment Fraction (R) = 0.20
  - Total Labour (L) = 100
  - Depreciation Fraction (D) = 0.1

