# Math 1LS3 Week 3: Discrete Time Dynamical Systems

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This week covers Chapter 2 of the textbook (2.1-2.3; we're skipping 2.4,2.5). Next week is 3.1-3.4. Warning for pacing: 3.3 is relatively long. We'll then finish Chapter 3 the following week.

- Overview
- 2 DTDSs: First Examples
- Visual Representations of a DTDS
- Examples
- 5 Composition of Updating Functions
- 6 Equilibrium
- More examples
- Yet more examples

### Overview

You studied discrete-time dynamical systems (DTDS) in grade school!

- Start at 0 and repeatedly add 1 counting
- Start at s and repeatedly add 1 (t times) addition (s + t)
- Start at 0 and repeatedly add d (t times) multiplication ( $d \cdot t$ )
- Start at 1 and multiply by r(t times) exponentiation  $(r^t)$

#### A DTDS consists of:

- Starting value, m<sub>0</sub>: "intial value"
- Operation to repeat, f: "rule"/"updating function"

Main Question: What happens as we repeatedly apply f? This week, we'll start to answer this question. After we learn some calculus, we will return to it in week 9.

### Sequences

A discrete time dynamical system yields a **sequence** by *iteration*.

$$m_1 = f(m_0)$$
  
 $m_2 = f(m_1) = f^2(m_0) = f(f(m_0))$   
 $m_3 = f(m_2) = f^3(m_0) = f(f(f(m_0)))$   
 $m_4 = f(m_3) = f^4(m_0) = f(f(f(f(m_0))))$ , etc.

### Example

Initial Value:  $m_0 = 1$ .

Updating Function:  $f(m) = 2 \cdot m$ .

1	2	4	8	16	32	64	128
$m_0$	$m_1$	$m_2$	<i>m</i> <sub>3</sub>	$m_4$	$m_5$	$m_6$	m <sub>7</sub>

# Rules vs. Updating Functions

A **rule** is pretty much the same information as an *updating function*.

### Example

Initial Value: 
$$m_0 = 3$$
.

Rule: 
$$m_{t+1} = m_t - 1$$
.

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### Example

What is the rule corresponding to  $f(m) = m^2$ ? Answer:  $m_{t+1} = m_t^2$ 

$$\boxed{\text{DTDS}} = \left( \begin{array}{c} \text{Initial value } m_0 \& \\ \text{(Rule } or \text{ Updating Function)} \end{array} \right)$$

### Updating Functions vs. Sequences

• The updating function f is a function.

current entry in sequence  $\mapsto$  next entry in sequence

• The sequence  $m_t$  is also a function.

$$t\mapsto m_t$$

### Warning: these are not the same functions!

- The updating function tells how to do *one step*.
- We will graph both functions later to study the DTDS.

#### Iteration

Repeatedly doing something is called **iteration**.

Initial Value:  $m_0$  Updating Function: f

$$m_1 = f(m_0)$$
  
 $m_2 = f(m_1) = f(f(m_0))$   
 $m_3 = f(m_2) = f(f(f(m_0)))$   
 $m_4 = f(m_3) = f(f(f(f(m_0))))$   
 $\vdots$   
 $m_{t+1} = f(m_t) = f^{t+1}(m_0)$ 

Warning:  $f^n(x)$  does not mean  $(f(x))^n$ , but  $\sin^2(\varphi)$  means  $(\sin(\varphi))^2$ . " $\sin^2(\varphi)$  is odious to me"–C.F. Gauss

**Solving** a DTDS means finding a direct formula for  $m_t$ .

### Solution to a DTDS

### **Solving** a DTDS means finding a direct formula for $m_t$ .

- Start at  $m_0 = 0$ .
- f(x) = x + 6.
- Repeatedly add 6:  $m_{t+1} = m_t + 6$ .

What is  $m_7$ ?  $m_7 = 6 \cdot 7 = 42$ . What is  $m_t$ ?  $m_t = 6 \cdot t$ .

$$m_t = 6 \cdot t$$
 is a solution to this DTDS.  
6 ·  $t$  is a direct function of  $t$ : no reference to  $m_{t-1}$ .

Q: Why did you learn how to multiply?

A: To repeatedly add without having to repeatedly add.

Moral: solutions are nice – they fully answer our main question.

# Using a DTDS as a mathematical model

#### In a DTDS model:

- t is usually time (independent variable).
- *m* is some physical quantity (dependent variable).
- $m_t$  is the value of m at time t.

### When constructing a model:

- First identify the *updating function* (one step: from  $m_t$  to  $m_{t+1}$ ).
- ② After that, look for a solution (from t to  $m_t$ ).

### In addition to the updating function, the model should specify:

- How long is one time step?
- What does *m* represent?
- In what units is *m* measured?

### **Updating Functions**

### In a DTDS model, t is usually time.

An updating function f tells you how to compute the next value  $(m_{t+1})$  from the current value  $(m_t)$ .

$$m_{t+1} = f(m_t)$$

#### **Problem**

Find updating functions for the follwing scenarios.

- A tree grows 0.8m every year. Its height at time t is  $h_t$ , with t in years,  $h_t$  in meters.
- ② A bacteria colony doubles in size every hour. Its population at time t is  $P_t$ , with t in hours.

#### Solution

- **1**  $h_{t+1} = h_t + 0.8$ , so the updating function is  $f(h_t) = h_t + 0.8$ .
- 2  $P_{t+1} = 2P_t$ , so the updating function is  $g(P_t) = 2P_t$ .

# Solving a discrete-time dynamical system

**Solving** a DTDS means expressing  $m_t$  as a function of just t.

#### **Problem**

A tree starts at 1m and grows 0.8m each year. Write and solve the dynamical system for the height  $h_t$ .

### Solution

The dynamical system consists of:

- Initial height:  $h_0 = 1$ .
- Interval length: 1 year.
- Updating function:  $h_{t+1} = h_t + 0.8$ .

The solution is  $h_t = 1 + 0.8t$ .

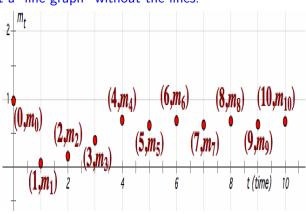
Note: The solution expresses  $h_t$  in terms of t. The updating function expresses  $h_{t+1}$  in terms of  $h_t$ .

# Graphing a Discrete-Time Dynamical System

### Visual Representation 1: *Graphing a DTDS*

Just a "line graph" without the lines.

$m_t$
0.978897
0.059908
0.163326
0.396286
0.693806
0.616074
0.685928
0.624749
0.679869
0.631177
0.675099



- What does graph suggest about the "Main Question" for this DTDS?
- Do we know for sure?
- The graph consists of discrete, isolated points. (Why?)

### Graphing a Sequence along a Line

# Visual Representation 2: Graphing a DTDS along a line Same DTDS as previous slide.

- Plot the values on a horizontal or vertical line.
- Label the points

What does the image suggest about the "Main Question" for this DTDS?

Do we know for sure?

### Graphing the Updating Function

Visual Representation 3: Graphing the Updating Function

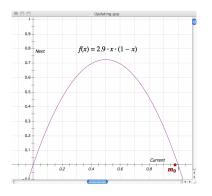
Just the graph of y = f(x). Same DTDS as previous slides.

- Textbook labels the axes: "initial" (x-axis) and "final" (y-axis).
- Better to say: "current" (x-axis) and "next" (y-axis).

Note: f is typically continuous but  $m_t$  is discrete.

### Graphing the Updating Function

What can we tell about this particular DTDS from the graph of y = f(x)?

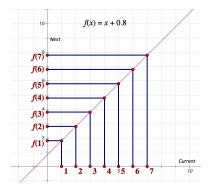


- If current value is small, next value is small (but a little bigger).
- Medium (near .5)  $\mapsto$  big, while big  $\mapsto$  small.
- What happens upon many iterations? Not easy to say (yet).

### Graphing the Updating Function: Tree Growth

But some updating functions do answer the main question.

DTDS with 
$$h_{t+1} = f(h_t) = h_t + 0.8$$
. What happens?

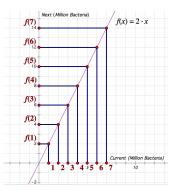


(Some equally spaced inputs)

- Current value increases by fixed amount to get new value.
- What happens upon many iterations? Height goes off to  $\infty$ .

# Graphing the Updating Function: Bacteria Growth

DTDS with  $P_{t+1} = f(P_t) = 2P_t$ . What happens?



(Some equally spaced inputs)

- Current value doubles to get new value.
- Larger current values experience even larger growth.
- What happens upon many iterations? Population explodes exponentially to  $\infty$ .

# Cobwebbing: Combining the Best of (2) and (3)

Visual Representation 4: Cobwebbing Same DTDS as in (1),(2),(3)

We want to take this sequence from before. . .

and plot instead along the diagonal line (y = x).

# Cobwebbing: Combining the Best of (2) and (3)

### Visual Representation 4: Cobwebbing Same DTDS as in (1),(2),(3)

Instead of plotting  $x_0$ , plot  $(x_0, x_0)$ . Instead of plotting  $x_1$ , plot  $(x_1, x_1)$ , etc.

Now we'll connect the points to visualize the sequence order.

# Cobwebbing

$$x_1=f(x_0)$$

$$x_2 = f(x_1)$$

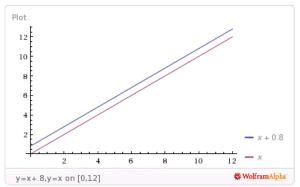
$$x_3 = f(x_2)$$

- One step is a vertical move followed by a horizontal move.
- What do we see about the Main Question?

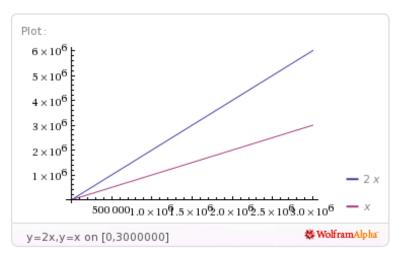
# Cobwebbing (Tree Growth Example)

Using the graph of the updating function, *cobwebbing* lets you see lots of iterates.

- (Current, next) pair  $(m_t, m_{t+1})$  on graph of f.
- Move horizontally to line y = x: get point  $(m_{t+1}, m_{t+1})$ .
- Move vertically to f: get point  $(m_{t+1}, m_{t+2})$ .
- Repeat.



# Cobwebbing (Bacteria Example)



Click: Cobweb Plot Applet. Try 2\*x with initial value 0.001.

# Bacteria Population Example

#### **Problem**

A bacteria population  $P_t$  doubles every hour, starting at 1 million. It doubles every hour. Write and solve a dynamical system.

#### Solution

The dynamical system consists of:

- Initial population:  $P_0 = 10^6$ .
- Interval length: 1 hour.
- Updating function:  $P_{t+1} = 2P_t$ .

The solution is  $P_t = 10^6 * 2^t$ .

# Repeated Addition, Repeated Multiplication

Basic additive DTDS:

lf

- Initial value is A, and
- updating function is  $f(m_t) = m_t + B$ ,

then the solution is  $m_t = A + t * B$ .

### Basic exponential DTDS:

lf

- Initial value is A, and
- updating function is  $f(m_t) = B * m_t$ ,

then the solution is  $m_t = A * B^t$ .

Memorize this slide. (Better yet, understand it as the *definition* of multiplication, exponentiation!)

# Dynamics of Absorption of Pain Meds (p.95)

#### Problem

A patient takes one dose of the pain drug methadone each day. The half-life of the drug in this patient is 24 hours. Describe an updating function for the amount of drug in the body and solve the DTDS.

#### Solution

If  $m_t$  is the current amount (in doses), then tomorrow the patient has

- half of today's m<sub>t</sub> left, plus
- the 1 new dose they take tomorrow.

So the update function is  $f(m_t) = \frac{m_t}{2} + 1$ .

Examples 2.1.8, 2.1.9 (p.100-101) solve the dynamical system for different initial values of m. Let's try the general case. . .

It's hard – so just focus on the main ideas.

# Solving a linear DTDS: $f(m_t) = (m_t)/2 + 1$

### Solution

<u>Observe</u>: if  $m_t = 2$  doses, then  $m_{t+1} = 2$ . So  $m_{t+2} = 2$ , etc.

Idea: introduce a new variable e = m - 2, so  $m_t = 2 + e_t$ .

e represents excess dosage – dosage beyond 2.

Find a DTDS for e:

$$e_{t+1} = m_{t+1} - 2 = \left(\frac{m_t}{2} + 1\right) - 2 = \frac{2 + e_t}{2} - 1 = \frac{e_t}{2}$$

So  $e_t$  is an exponential DTDS:

$$e_t = e_0 \cdot \left(\frac{1}{2}\right)^t = \left(m_0 - 2\right) \left(\frac{1}{2}\right)^t$$

Solving the original DTDS:

$$m_t = 2 + e_t = 2 + (m_0 - 2) * (1/2)^t$$

# Running a DTDS Backwards

How can we run a discrete-time dynamical system backwards? f does one step forward, so  $f^{-1}$  does one step backward. The "backwards DTDS" has updating function  $f^{-1}$ .

### Problem

Bacteria pop. doubles each hr. Now it's  $10^6$ . What was it 3 hrs ago?

#### Solution

Update function  $f(P_t) = 2P_t$ , so  $f^{-1}(P_t) = \frac{1}{2}P_t$ . Current value is  $10^6$ .

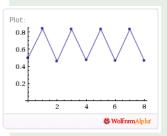
time	population			
now	10 <sup>6</sup>			
1 hour ago	$f^{-1}(10^6) = 500000$			
2 hours ago	$f^{-1}(500,000) = 250000$			
3 hours ago	$f^{-1}(250,000) = 125000$			

### Self-Composition

 $f(m_t) = m_{t+1}$ . In words, f computes the next value from the current value. What does  $f \circ f$  compute? Two steps into the future.

### Example

The DTDS:  $f(x_t) = 3.35x_t(1 - x_t), x_0 = 0.5$  oscillates.



Study an auxilliary DTDS with:

- updating function  $f \circ f$
- initial value 0.5

Iterate the *auxilliary DTDS*. What happens?  $m_{\text{even}}$ 's only. Stabilizes!

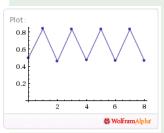
Click: Cobweb Plot Applet. Compare f(x) = 3.35\*x\*(1-x) and  $f \circ f(x) = 11.2225*x-48.8179*x^2+75.1908*x^3-37.5954*x^4$ .

### Self-Composition

 $f(m_t) = m_{t+1}$ . In words, f computes the next value from the current value. What does  $f \circ f$  compute? Two steps into the future.

### Example

The DTDS:  $f(x_t) = 3.35x_t(1 - x_t), x_0 = 0.5$  oscillates.



Study an auxilliary DTDS with:

- updating function  $f \circ f$
- initial value f(0.5) = 0.8375

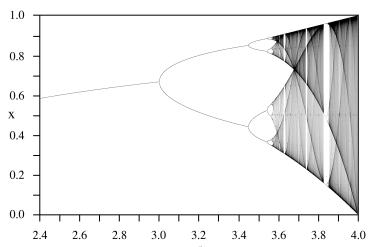
Iterate the *auxilliary DTDS*. What happens?  $m_{\text{odd}}$ 's only. Stabilizes!

Click: Cobweb Plot Applet. Compare f(x) = 3.35\*x\*(1-x) and  $f \circ f(x) = 11.2225*x-48.8179*x^2+75.1908*x^3-37.5954*x^4$ .

# Play with the parameter: change 3.35

Click: Cobweb Plot Applet

We looked at f(x) = 3.35\*x\*(1-x). Change r = 3.35 to interesting r-values below. See what happens. Challenge: compute bifurcation points.



# Equilibrium (Algebraic Description)

An equilibrium point  $m^*$  for a dynamical system is where  $f(m^*) = m^*$ . If  $m^*$  is equilibrium point and  $m_t = m^*$ , then  $m_{t+1} = m^*$ ,  $m_{t+2} = m^*$ , etc.

#### **Problem**

Find the equilibrium points for the pain medication DTDS:  $f(m_t) = \frac{m_t}{2} + 1$ .

### Solution

Solve  $f(m^*) = m^*$ .

$$m^* = \frac{m^*}{2} + 1$$

$$\frac{m^*}{2} = 1$$

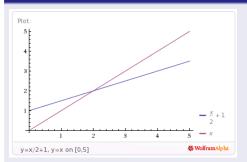
$$m^* = 2$$

There is just the one equilibrium point:  $m^* = 2$ .

### Equilibrium: Geometric Description

Find the equilibrium points for  $f(m_t) = 1 + \frac{m_t}{2}$  geometrically. Then cobweb starting with  $m_0 = 1$  and with  $m_0 = 4$  to see what happens.

### Solution



The equilibrium point is the intersection point:  $m^* = 2$ . Starting at  $m_0 = 1$  or  $m_0 = 4$ , cobwebbing draws us in to this equilibrium.

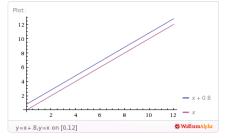
An equilibrium point is **stable** if nearby values are drawn in.

An equilibrium point is unstable if nearby values are pushed away.

# Tree Growth, Bacteria Colony Equilibria

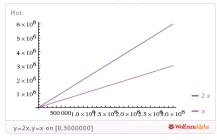
Find the equilibria. Are they stable?

Tree growth:  $f(m_t) = m_t + 0.8$ .



No equilibrium value!

Bacteria colony:  $g(P_t) = 2P_t$ .



Equilibrium only at  $P^* = 0$ . Is it stable? No, unstable.

# Stable/Unstable Equilibria Summary

- An equilibrium point is where  $f(m^*) = m^*$ .
- An equilibrium point is where y = f(x) intersects y = x.
- The equilibrium  $m^*$  is *stable* if nearby points are drawn in by cobwebbing.
- The equilibirum  $m^*$  is unstable if nearby points are pushed away.

Note: if you can't

- graph f, or
- directly solve  $f(m^*) = m^*$ ,

you can computer search for stable equilibria.

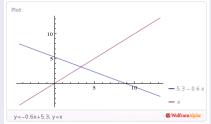
How? By iterating! Unstable equilibria remain hidden. —

### Example 2.2.6: p.117

Codfish population is given by the updating function  $n_{t+1} = -0.6n_t + 5.3$  (million codfish). Find equilibria and classify as stable/unstable.

### Solution

Solve  $-0.6n^* + 5.3 = n^*$  to find unique equilibrium  $n^* \approx 3.3125$  Cobweb to determine stability:



Spirals in towards equilibrium: stable!

One more problem (time permitting): go back to f(t) = 3.35 \* x \* (1 - x) and find stable/unstable fixed points. What about  $f \circ f$ ?

# Per Capita Production: p.123-4

#### Problem

Consider the bacteria population model  $P_{t+1} = r * P_t$ .

The parameter  $r \ge 0$  is called **per capita production**.

Find equilibria and classify as stable/unstable.

Note: this is the basic exponential DTDS.

#### Solution

For equilibrium  $P^*$ , solve  $rP^* = P^*$ .

If  $r \neq 1$ , the unique solution is  $P^* = 0$ .

If r = 1, then every point is an equilibrium value!

If r > 1, the equilibrium is unstable. (Exponential growth!)

If r < 1, the equilibrium is stable. (Exponential decay!)

Homework: verify stability by Cobwebbing.

Memorize (or understand) this result! We'll use it later.

Note: r is still called **per capita production** if it's a *function* of  $P_t$ .

# Limited Population Model: p.126-7

In *limited population models*, the per capita production is a variable rate. It decreases as the population gets bigger. The resulting population doesn't grow as quickly as in the exponential case.

#### Problem

Consider the limited population model

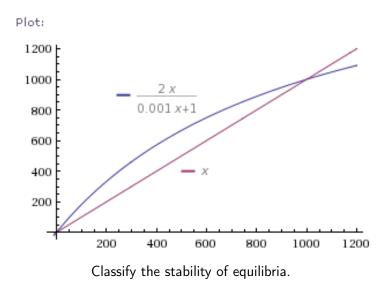
$$b_{t+1} = \left(\frac{2}{1 + 0.001b_t}\right)b_t.$$

Find equilibria and classify as stable/unstable. (Cobweb.)

### Solution

Solve 
$$b^* = \frac{2}{1+0.001b^*}b^*$$
.  
Either  $b^* = 0$  or  $1 = \frac{2}{1+0.001b^*} \implies 1 + 0.001b^* = 2 \implies b^* = 1000$ .  
There are two equilibria ( $b^* = 0$  is unstable;  $b^* = 1000$  is stable).

### Limited Population Model: p.126-7 Cobweb Plot



# Caffeine Absorption Model

#### **Problem**

The body eliminates caffeine at a constant rate of 13% per hour. Find the updating function if d extra mg of caffeine are consumed each hour.

- c<sub>t</sub> is caffeine present in body in mg.
- One time step = 1 hour

### Solution

$$f(c_t) = .87c_t + d$$

- The half-life is  $\approx$  5 hours.
- Caffeine taken by 2PM should be about quartered by midnight.

# Alcohol Dynamics

Unlike caffeine, which is eliminated at a constant proportion, the liver removes alcohol at a rate that decreases with amount present:

$$r(a_t) = \frac{10.1}{4.2 + a_t}.$$

#### **Problem**

A student drinks d grams of alcohol at the end of each hour. Write an updating function to describe the amount  $a_t$ .

#### Solution

$$a_{t+1} = a_t - r(a_t)a_t + d = a_t - \frac{10.1a_t}{4.2 + a_t} + d$$

### Alcohol Equilibrium

#### **Problem**

A student drinks one standard drink (14g) and keeps consuming a drink on the hour. What happens?

#### Solution

To find equilibrium:

$$a^* = a^* - \frac{10.1a^*}{4.2 + a^*} + 14$$

$$10.1a^* = 14(4.2 + a^*) = 58.8 + 14a^*$$

$$a^* = -15.1$$

The only equilibrium is biologically meaningless, so  $a_t$  can't approach an equilibrium.

Cobwebbing shows alcohol level increases without end. . .

# Alcohol Equilibrium Continued

