use (4) again (with the definition from one-variable calculus of $\frac{d}{dt}x$ and $\frac{d}{dt}y$) to tell differ only slightly from $x_0 + f[x(\Delta t), y(\Delta t)]\Delta t + f(x_0, y_0) \Delta t$ and $y_0 + g[x(\Delta t), y(\Delta t)]\Delta t$ you (approximately) the values for $x(2\Delta t)$ and $y(2\Delta t)$. Indeed, for small Δt , these $y(\Delta t)]\Delta t + g(x_0, y_0) \Delta t$, respectively. Then, you can iterate the preceding to find x and y at $t = 3\Delta t, 4\Delta t, \dots, etc.$ In any event, once you know the coordinates $x(\Delta t)$ and $y(\Delta t)$, then you can

6.4 Generalities

sort of heuristic picture by first drawing the (x, y) plane and indicating the regions coordinates of the moving point change with time. In particular, you can develop a represented by a moving point in the plane. Then (4) tells you how the x- and y-Imagine a movie of the xy-plane with the position (x(t), y(t)) of the solution to (4) (x(t), y(t)) moves up and to the right as the movie progresses because both x(t) and in a region where, for example, f>0 and also g>0, you know that the path of where f = 0, f > 0, and f < 0. Do likewise for the function g. Then, if you are and where f < 0 and where g > 0 or g < 0. This sort of analysis is called **phase** direction of motion for (x(t), y(t)), where f > 0 and g < 0 (down and to the right), y(t) are increasing where f>0 and g>0. Similar analysis tells you the rough plane analysis.

Summary of Phase Plane Analysis

Here is a summary of phase plane analysis for a differential equation of the form in Equation (4) where f and g are two given functions on the xy-plane.

6.5.1 General Strategy

- Pick a starting point in the plane; there is a unique solution $\mathbf{v}(t) = \begin{pmatrix} x(t) \\ y(t) \end{pmatrix}$ to (4) that sits at your chosen starting point at t = 0.
- Think of v(t) as tracing out a path (trajectory) in the xy-plane as t increases. A goal is to predict the behavior of this path.
- The phase plane analysis described next is designed to help you predict the tra-
- Step 1: Draw the curves where f(x, y) = 0. These are called the x null clines for such a null cline can only do so if it is moving purely in the vertical direction at the the following reason: When v(t) lies on one of these null clines, then $\frac{dx}{dt} = 0$. Draw vertical slash marks on the x null clines to remind yourself that a trajectory that crosses Here are the six steps for the phase plane analysis:

instant of crossing.

clines because when v(t) happens to sit on one, then $\frac{dy}{dt} = 0$. Draw horizontal slash Step 2: Likewise, draw the curves where g(x, y) = 0. These are called the y null does so by moving purely in the horizontal direction at the instant of crossing. marks on these null clines to remind yourself that a trajectory that crosses a y null cline

ever at one of these points, then both $\frac{d\lambda}{dt}$ and $\frac{d\lambda}{dt}$ vanish. This means that the trajectory Step 3: Label the points where the x null clines intersect the y null clines. If v(t) is points as t gets large. going to settle into a steady state, then v(t) will have to approach one of the equilibrium clines are called equilibrium points. If the system that is described by Equation (4) is stays at such a point for all time. These intersection points of x null clines and y null

Step 4: Label the regions of the xy-plane where $\frac{dx}{dt} < 0$ and where $\frac{dx}{dt} > 0$. (Note that $\frac{dy}{dt}$ is positive and negative. these regions are always separated by x null clines.) Likewise, label the regions where

cline in the $\frac{dx}{dt} > 0$ regions and left pointing on the parts in the $\frac{dx}{dt} < 0$ regions. that decorate the y null clines. The arrows are right pointing on the parts of the y null null cline in the $\frac{dY}{dt}$ < 0 regions. Likewise, draw arrows on the horizontal slash marks on the parts of the x null cline in the $\frac{dy}{dt} > 0$ regions, and down on those parts of the x arrows indicate whether motion across the null cline is up or down. The arrows are up Step 5: Go back and put arrows on the vertical hash marks of the x null clines. These

trajectory $\mathbf{v}(t)$ lies in a region where Step 6: With the preceding completed, the analysis proceeds by observing that if the

- (a) $\frac{dx}{dt} > 0$ and $\frac{dy}{dt} > 0$, then both x(t) and y(t) are increasing, so the trajectory must be moving up and to the right on the xy-plane.
- (b) $\frac{dx}{dt} > 0$ and $\frac{dy}{dt} < 0$, then x(t) is increasing but y(t) is decreasing so the trajectory moves down and to the right.
- $\frac{dx}{dt}$ < 0 and $\frac{dy}{dt}$ > 0, then x(t) is decreasing and y(t) is increasing, so the trajec tory moves up and to the left.
- (d) $\frac{dx}{dt} < 0$ and also $\frac{dy}{dt} < 0$, then x(t) and y(t) are both decreasing, so the trajectory moves down and to the left.

of it), but it is a very powerful tool for analyzing the long-time evolution of a solution that in Equation (4). to an equation such as given in (4). However, there now exist good computer programs that will trace the trajectories in the xy-plane of solutions to differential equations like Note: This sort of analysis is not quantitative (it is hard to get real numbers out

Phase Plane Analysis for the Epidemic Model

 $\lambda = 10^{-6}$. These equations read As an example of phase plane analysis, consider the example in Equation (2) where

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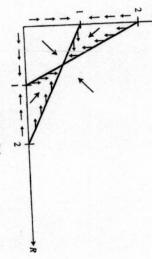


Figure 5

- The trajectory starts in Region (IV) and moves up and to the right initially. At some point, L becomes larger than R, and then sometime later, the trajectory some point, In becomes larger than R, and to the right. In Region (III), the enters Region (III) moving horizontally and to the right. In Region (III) since trajectory moves down and to the right, but it can never leave Region (III) since all of the hash mark arrows are pointing to this region. Thus, the trajectory is forced to approach ever closer the equilibrium point (2/3, 2/3) as time evolves.
- The trajectory starts in Region (IV) and moves up and to the right initially. The value of R stays larger than L, and the trajectory eventually enters Region (II) by crossing the R null cline where L=2(1-R) moving vertically. Once in the Region (II), the trajectory moves up and to the left. The trajectory cannot exit Region (II) since all of the hash marks on the boundary of the region are pointing Region (II) since also, the trajectory is forced to approach ever closer to the in. Thus, in this case also, the trajectory is forced to approach ever closer to the equilibrium point (2/3, 2/3) as time evolves.
- The values of R and L approach equality as the trajectory advances up and to the right in Region (IV). Moreover, the trajectory stays in Region (IV), but approaches ever closer to the equilibrium point (2/3, 2/3).

Thus, we see that in the case where a=1/2 at least, all the preceding scenarios have the same result at large time: The initial value of R=0.51 and L=0.5 evolves in time toward the equilibrium point where R and L are equal with value 2/3. As R and L are definitely not equal in real life, we can see that the case a=1/2 for the

model in Equation (1) can be discarded. In fact, the a=1/2 behavior is characteristic of all a<1 versions of the model in Equation (1). Although there are quantitative differences with respect to the precise value for R and L of the limiting equilibrium point, the trajectory nonetheless approaches an equilibrium point where R=L. Thus, the case a<1 in the model in Equation (1) does not match real-world data.

On the other hand, the case a>1 is very much like that for a=2, and in this case, the conclusions in (11) still hold. In particular, in the a>1 case, one of the possibilities comes pretty close to the real-life situation. However, before we pat ourselves on the back, we should stop to ask whether a>1 is a reasonable assumption. Indeed, this case, where a>1, presents a simplified model for the situation where right-curling shells are more tolerant of the presence of other right-curling shells than other left-curling shells. Is this a reasonable assumption? What do you think?

Here are some possible scenarios: Perhaps shells cannot distinguish the curling direction of their neighbors. Alternately, suppose that shells do detect the curling direction of their neighbors, but are less tolerant of like-curling neighbors rather than more tolerant. Indeed, suppose that like-curling shells breed only with each other. Furthermore, suppose that snails come in males and females. (Do they?) Then right-curling males might fight-curling males for dominance, but tolerate right-curling females; and likewise, right-curling females might fight right-curling females and tolerate right-curling males. Meanwhile, both ignore left curlers as these do not represent competition for breeding success, only competition for food. [Here is where a model suggests directions for field research and experiments. The point is that the question of whether the constant a in (1) is greater than 1 may, in principle, be verified by field research.]

5.3 The Lotka-Volterra Equation, a Predator-Prey Model

Austrian biophysicist Alfred Lotka and Italian mathematician Vito Volterra separately wrote down and analyzed a system of differential equations that model the interaction of predator and prey species. We give the example of the predator being foxes and the prey being hares. Let F(t) denote the number of foxes at time t, and let H(t) denote the number of hares. The model assumes that rates of change of F(t) and H(t) obey the equation

$$\frac{dH}{dt} = (a - bH - cF)H,$$

$$\frac{dF}{dt} = (-d + eH)F,$$

where a, b, c, d, and e are positive constants that we might hope to determine from field research data.

To help see the significance of these constants to the model, consider first writing the first line in (10) as

$$\frac{dH}{dt} = \alpha H,\tag{11}$$

where $\alpha = a - bH - cF$ is the net birth-death rate for hares when H is the number of hares and F is the number of foxes. Notice that when F = 0, so there are no foxes, then (11) is exactly the logistics equation that we studied previously. Thus, we can identify a as an intrinsic growth rate of hare in an ideal environment and we can

identify a/b with the carrying capacity of the environment in the absence of foxes. enclosure that is fenced to keep all foxes at bay. Meanwhile, if we let F be nonzero, Thus, we could, in principle, measure a and b by raising hares in a sufficiently large mine the constant c by measuring the birth versus death rate of hares in a patch of the and also with increasing number of hares (which is debatable). We might try to deter-Note that this effect increases with increasing number of foxes (as we might expect) we see that the term -cFH in (10) models the predatory effects of foxes on the hares.

environment that is not fenced to preclude fox predation. death rate for foxes. Here, we see that when H=0, the fox equation reads F'=is no alternative source of prey. Such an assumption may not be tenable in any given is expected: Without hares, the foxes will starve. (Of course, this assumes that there -dF, with solution $F(t) = F(0)e^{-dt}$. This decreases to zero as t increases which environment.) The term +eHF in the second line of (10) models the positive effect of hares on the birth rate of foxes. That is, if hares are present, the foxes eat well and the birth rate increases, while the death rate decreases. So hares have a positive effect their birth and death rates as a function of food supply are monitored by raising foxes in an enclosed environment where there food supply is controlled and on the rate of change of F. The measurement of d and e can also be made (perhaps) In the second line of (10) we can identify the quantity -d + eH as a net birth-

To simplify the subsequent story, I will now choose the constants a, b, c, d, and

e that appear in (10) so that the equations read

$$\frac{dH}{dt} = (2 - H - F)H,$$

$$\frac{dF}{dt} = (-1 + H)F.$$
(12)

drawing of a plane with axis labled H (say the horizontal axis) and F (say the vertical As in the previous examples, the analysis of these equations for H and F starts with the axis). We next draw the H null clines. From the right side of the first line in (12), we

see that these occur where

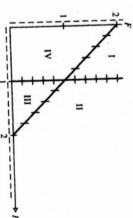
$$H=0$$
 or $F=2-H$.

Mark these H null clines with vertical slash marks to indicate that the trajectories cross

these lines moving vertically. line of (12), we see that these occur where F=0 or H=1. Mark the F null The next step is to draw the F null clines. From the right-hand side of the second

clines with horizontal slash marks to indicate that the trajectories cross them moving

horizontally. The resulting (H, F) plane looks like Figure 5.7. clines cross the F null clines. In this example, they are (0,0), (2,0), and (1,1). Note derivatives of H and of F vanish at such a point. (That is why they are called equilibrium points.) Note that neither (1,0) nor (0,2) are equilibrium points. Indeed, that if a trajectory starts at an equilibrium point, it stays there forever since both the neither is the intersection of an H null cline with an F null cline as the former is the intersection of two H null clines and the latter is the intersection of two F null clines. As remarked previously, the equilibrium points are the points where the H null



5.3 The Lotka-Volterra Equation, a Predator-Prey Model

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Figure 5.7

in Region (II) and we see from the right-hand side of (12) that at this point side of (12) the H and F values for the chosen point. For example, the point (3, 1) is decide on the general direction of motion in that region by plugging into the right-hand general, any number of regions.) By choosing a point in each region in turn, we can fact that all of our examples have four regions is a coincidence. There could be, in As indicated in Figure 5.7, the null clines break the plane into four regions. (The

$$\frac{dH}{dt} = -6,$$

$$\frac{dF}{dt} = 2,$$
(14)

are marked on the H-F plane as in Figure 5.8. the remaining regions can be determined by a similar strategy. The resulting directions and so the motion in Region II is up and to the left. The general direction of motion in

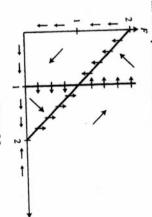


Figure 5.8

the direction of motion across these null clines. These arrows can be determined as Figure 5.8 also has arrows exhibited on the null-cline slash marks to indicate

motion must be to the left. Likewise, the motion in Region (I) is down and to the gion (II), it is up and to the left, so on the null cline between these two regions, the follows: We note that in Region (I) the motion is down and to the left, while in Releft, while in Region (IV), it is down and to the right, so the motion on the null cline between these regions is down. On the other hand, the motion in Region (III) is up null cline between them must be purely to the right. The direction of motion on the null and to the right and as that in Region (IV) is down and to the right, the motion on the

cline between Regions (II) and (III) is determined by a similar analysis. To determine the direction of motion across the part of the boundary of Region (I)

on the F-axis, we note that the motion in Region (I) is down and to the left and on this null cline, the direction is purely vertical, so it must be down. In Region (IV), the motion is down and to the right, so the motion on the F-axis part of the boundary Region (IV) (which is horizontal) must be to the right. The directions of the arrows on of Region (IV) (which is vertical) must also be down, while that on the H-axis part of

the other parts of the H-axis are determined by a similar analysis. With the H-F plane completely marked, we are now ready to consider the qual-

itative properties of hare-fox evolution as predicted by our model.

is up and to the left, and so the trajectory takes off in this direction. This up and to the left motion persists until the F null cline at H=1 is crossed from right to left and proceeds until the trajectory hits the H null cline where F=2-H. The trajectory the trajectory enters Region (I). Here, the motion is down and to the right. This motion In particular, suppose we start at the point (3, 1) in Region (II). The motion here

crosses this null cline pointing down and continues into Region (IV). At this point, the careful reader might wonder why the trajectory has no collision

with the F-axis. The reason is quite simple: Motion on the F-axis is straight down, and this precludes a trajectory from hitting this axis from the side. Indeed, if a trajectory were ever to hit the F-axis, it would move straight down it. Then, if we imagine filming the action and running the film backward, we would see the trajectory move up the Ftrajectory leave this axis and thus it couldn't have hit the F-axis to begin with unless it axis. As the time derivative of H on the F-axis is exactly zero, we would never see the

started there. There is a general principle at work here: A vertical H null cline cannot be crossed since motion on this line is purely

ullet A horizontal F null cline cannot be crossed since motion on this line is purely

until it crosses the F null cline at H=1. (The trajectory can't hit the H-axis unless it starts there since the time derivative of F is zero there. This is the second point above.) the H null cline where H=2-F is crossed, this time moving up. The trajectory then and enters Region (III) and then moves up and to the right. This motion persists until The trajectory then crosses the H=1 part of the F null cline moving from left to right In any event, once in Region (IV), the trajectory moves now down and to the right

reenters Region (II) and begins to cycle around again. Figure 5.9 contains a rough sketch of the trajectory as determined so far.

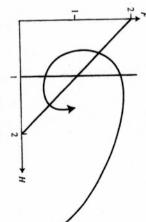


Figure 5.9

However, at this point, we do not have the tools to decide between the following two Thus, we see that the trajectory circles around the equilibrium point at (1, 1).

- The trajectory approaches a closed loop trajectory that encircles the equilibrium prey numbers. point (1, 1). The latter would describe a cyclic oscillation of the predator and
- The trajectory spirals slowly into the equilibrium point (1, 1). Note that (approx. imately) cyclic behavior in natural predator-prey populations is not uncommon.

5.4 Lessons

Here are some key points from this chapter.

- Information can be obtained from a differential equation as in (1) or (10) without having to solve the equation.
- Study the phase plane analysis for the examples of (1) and (10). In particular, familiarize yourself with the drawing and marking of null clines and equilibrium direction of movement of a solution on the phase plane. points in these examples, and study how they are used to discern the general

READINGS FOR CHAPTER 5

READING 5.1

Left Snails and Right Minds

constant that measures the relative interaction between right- and left-handed snails of the same species. Let L(t) and R(t) denote their respective populations after time t. Here is a model: $\frac{dL}{dt} = L - L^2 - aRL$ and $\frac{dR}{dt} = R - R^2 - aLR$. Here, a is a positive page 23) to try to model the interaction between left-curling and right-curling snails We are returning to this article from Chapter 2 (Reading 2.2; see