### Equilibrium and Stability

Extended from Chapter 3 of Sustainable Management of Natural Resources. Mathematical Models and Methods by Luc DOYEN and Michel DE LARA

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Equilibrium and Stability

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# Equilibrium and stability analysis provides insight into factors driving world's fisheries non-sustainability

#### Towards sustainability in world fisheries

Pauly, D. V. Christensen, S. Guénette T.J. Pitcher, U.R. Sumaila, C.J. Walters, R. Watson and D. Zeller. Nature, 2002



• Open-access nature of many fisheries

- Common-pool fisheries that are managed non-cooperatively
- Sole-ownership fisheries with high discount rates and/or high price-to-cost ratios ones
- Payment of subsidies by governments to fishers. which generate 'profits' even when resources are overfished



- 2 Sustainable yield and related notions
- Stability



#### Equilibrium

- Definition of equilibrium (under constraint)
- Examples of equilibria
- 2 Sustainable yield and related notions
  - Sustainable yield for surplus model
  - Maximum sustainable equilibrium
  - Private property equilibrium
  - Common property equilibrium
  - Examples
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  - Definition of stability of an equilibrium state
  - Stability for dynamical linear systems
  - Linearized dynamics and stability
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Equilibrium is the mathematical concept carrying the idea of sustainability as balance and stationarity



# We consider autonomous dynamical systems, that is, without explicit dependence upon time t

#### Recall that

- $x(t) \in \mathbb{X} = \mathbb{R}^n$  represents the state of the system
- $u(t) \in \mathbb{U} = \mathbb{R}^{p}$  stands for the control
- In an autonomous dynamical system, the dynamics does not depend directly on time t

x(t+1) = Dyn(x(t), u(t))

• Constraints are also time independent

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## Example of non autonomous system



Monthly growth rate

Monthly plant model

$$B(t+1)=R(t)B(t)$$

where the monthly growth rate is periodic, following the seasons

# An equilibrium is a steady state of an autonomous dynamical system



#### Equilibrium under constraints

The state  $x_{E} \in \mathbb{X}$  is an equilibrium under constraints if there exists a control  $u_{E} \in \mathbb{U}$  satisfying

 $egin{aligned} & \texttt{Dyn}(x_{ ext{E}}, u_{ ext{E}}) = x_{ ext{E}} & \texttt{steady state} \ & x_{ ext{E}} \in \mathbb{A} & \texttt{admissible state} \ & u_{ ext{E}} \in \mathbb{B}(x_{ ext{E}}) & \texttt{admissible control} \end{aligned}$ 

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## Equilibria are trivial for an exhaustible resource



Dynamics



• The resource stock  $S_{\rm E}$  and harvesting  $h_{\rm E}$  are stationary whenever

 $S_{\rm E}=S_{\rm E}-h_{\rm E}$ 

• The only equilibrium for any  $S_{\rm E}$  is

 $h_{\rm E}=0$ 

# Flooding in Cuzco Valley, Peru



# Mitigation policies for carbon dioxyde emissions

• Assuming stationary emissions E<sub>b</sub>

$$M(t+1) = M(t) \underbrace{-\delta(M(t) - M_{-\infty})}_{\text{natural sinks}} + \alpha \underbrace{E_b}_{\text{abatement}} \underbrace{(1 - a(t))}_{\text{abatement}}$$

• Any equilibrium  $(M_{\rm E}, a_{\rm E})$  satisfies

$$M_{\scriptscriptstyle \mathrm{E}} = M_{\scriptscriptstyle \mathrm{E}} - \delta (M_{\scriptscriptstyle \mathrm{E}} - M_{-\infty}) + \alpha E_b (1 - a_{\scriptscriptstyle \mathrm{E}}) \; ,$$

that is,

$$M_{\scriptscriptstyle 
m E} = M_{-\infty} + rac{lpha E_b(1-a_{\scriptscriptstyle 
m E})}{\delta}$$
 with  $0 \le a_{\scriptscriptstyle 
m E} \le 1$ 

# Populations may be described by abundances at ages



Jack Mackrel abundances (Chilean data) in thousand of individuals

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thousand of age < 1 (recruits) thousand of age  $\in [1, 2[$ 

thousand of age  $\geq 11$ 

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# Harvested population age-class dynamics

The spawning stock biomass is SSB(N) = 
$$\sum_{a=1}^{A} \underbrace{\gamma_{a}}_{\text{proportion}} \underbrace{\mu_{a}}_{\text{abundance}} N_{a}$$

$$N_{1}(t+1) = S/R\left(\underbrace{SSB(N(t))}_{\text{SSB}(N(t))}\right) \text{ recruitment}$$

$$N_{2}(t+1) = e^{-(M_{1}+\lambda(t)F_{1})}N_{1}(t)$$

$$\underbrace{-\left(M_{a-1}+\lambda(t)F_{a-1}\right)}_{\text{natural}} N_{a-1}(t) \quad a = 2, \dots, A-1$$

$$N_{A-1}(t+1) = e^{-(M_{A-2}+\lambda(t)F_{A-2})}N_{A-2}(t)$$

$$N_{A}(t+1) = e^{-(M_{A-2}+\lambda(t)F_{A-1})}N_{A-1}(t) + \underbrace{\pi e^{-(M_{A}+\lambda(t)F_{A})}}_{\text{plus group}} N_{A}(t)$$

An A age-classes equilibrium is solution of an algebraic system of A equations

$$\begin{pmatrix} S/R(SSB(N)) \\ N_1 \exp(-(M_1 + \lambda F_1)) \\ N_2 \exp(-(M_2 + \lambda F_2)) \\ \vdots \\ N_{A-2} \exp(-(M_{A-2} + \lambda F_{A-2})) \\ N_{A-1} \exp(-(M_{A-1} + \lambda F_{A-1})) \end{pmatrix} = \begin{pmatrix} N_1 \\ N_2 \\ N_3 \\ \vdots \\ N_{A-1} \\ N_A \end{pmatrix}$$

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# A-1 equations display a chained structure

The computation of an equilibrium  $N_{ ext{E}}(\lambda)$ , for  $\lambda \geq 0$ , gives

 $N_{a,{\scriptscriptstyle \mathrm{E}}}(\lambda) = s_a(\lambda) N_{1,{\scriptscriptstyle \mathrm{E}}}(\lambda)$ 

for  $a = 1, \ldots, A$ , where

$$s_a(\lambda) = \exp\left(-\left(M_1 + \cdots + M_{a-1} + \lambda(F_1 + \cdots + F_{a-1})\right)\right)$$

is the proportion of equilibrium recruits which survive up to age a (a = 2, ..., A) while  $s_1(\lambda) = 1$ 

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# Exercise: compute the equilibrium when the stock-recruitment is a Beverton-Holt function

• When the stock-recruitment is a Beverton-Holt function

$$S/R(B) = \frac{B}{\alpha + \beta B}$$

• the equilibrium recruits are either  $N_{1,{
m E}}(\lambda)=0$  or

$$\mathcal{N}_{1, ext{E}}(\lambda) = rac{ ext{spr}(\lambda) - lpha}{eta ext{spr}(\lambda)} ext{ when } ext{spr}(\lambda) > lpha$$

• where spr is the equilibrium spawners per recruits

$$\operatorname{spr}(\lambda) = \sum_{a=1}^{A} \gamma_a \mu_a s_a(\lambda)$$

Exercice: case A = 2 and interpret the condition spr(λ)/α > 1

# Summary

- An equilibrium is solution of an algebraic system of equations
- The number of equations is equal to the dimension of the state
- For control systems, equilibria are parameterized by the controls
- Constraints can restrict the number of admissible equilibria

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stainable yield for the Beverton-Holt model (tuna)

# The sustainable yield for the Schaefer model is the harvest attached to a biomass equilibrium

• The Schaefer model builds upon a biological dynamics

$$B(t+1) = \text{Biol}(\underbrace{B(t)}_{\text{biomass}} - \underbrace{h(t)}_{\text{catches}}) \text{ with } 0 \le h(t) \le B(t)$$

• At equilibrium, we have that

$$B_{ ext{\tiny E}} = ext{Biol}(B_{ ext{\tiny E}} - h_{ ext{\tiny E}})$$
 and  $0 \leq h_{ ext{\tiny E}} \leq B_{ ext{\tiny E}}$ 

• The stationay harvest  $h_{\rm E}$  solution to that equilibrium equation is the so-called sustainable yield

$$h_{\scriptscriptstyle ext{E}} = ext{Sust}(B_{\scriptscriptstyle ext{E}})$$

# The sustainable yield is a surplus production that can be harvested in perpetuity without altering the stock level

The relation  ${\tt Biol}(B_{\scriptscriptstyle
m E}-h_{\scriptscriptstyle
m E})=B_{\scriptscriptstyle
m E}$  may also be written as



### Sustainable yield curve for the blue whale



 $K = 400 \ 000 \ \text{BWU}$  $R \approx 1.05$ Beverton-Holt



# Exercise: compute the equilibrium when the biological dynamics is a Beverton-Holt function

- Biological Beverton-Holt dynamics  $Biol(B) = \frac{RB}{1+bB}$
- Any equilibrium  $(B_{\rm E}, h_{\rm E})$  satisfies

$$B_{ ext{ iny E}} = rac{R(B_{ ext{ iny E}}-h_{ ext{ iny E}})}{1+b(B_{ ext{ iny E}}-h_{ ext{ iny E}})} ext{ with } 0 \leq h_{ ext{ iny E}} \leq B_{ ext{ iny E}}$$

- Particular equilibria are
  - $(B_{\rm E}, h_{\rm E}) = (0, 0)$ •  $(B_{\rm E}, h_{\rm E}) = (K, 0)$  where  $K = \frac{R-1}{b}$  is the carrying capacity
- The sustainable yield is

$$\mathtt{Sust}(B) = B - rac{B}{R-bB} ext{ for } 0 \leq B \leq K$$

# Three equilibria are worth being distinguished: MSE, PPE, CPE



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# The sustainable yield has a hump-shape form as a function of biomass



Sustainable yield for the Beverton-Holt model (tuna)

The maximum sustainable yield is the maximum surplus production that can be harvested in perpetuity without altering the stock level

• The maximum sustainable equilibrium (MSE) is the biomass  $B_{\rm MSE}$  solution of

$$\operatorname{Sust}(B_{\scriptscriptstyle\mathrm{MSE}}) = h_{\scriptscriptstyle\mathrm{MSE}} = \max_{\substack{B \ge 0, \ h = \operatorname{Sust}(B)}} h = \max_{\substack{B \ge 0}} \operatorname{Sust}(B)$$

• The maximum catch *h*<sub>MSE</sub> is called the maximum sustainable yield (MSY)

### MSY is criticized for its simplistic assumptions

TRANSACTIONS of the AMERICAN FISHERIES SOCIETY

January 1977 VOLUME 105 NUMBER 1

#### An Epitaph for the Concept of Maximum Sustained Yield<sup>1</sup>

P. A. LARKIN Institute of Animal Resource Ecology, Uniowsky of British Columbia Functance, British Columbia Vot 1875

About 30 years ago, when I was a graduate famous "green book," the first version of his student, the idea of managing fisheries for handbook (Ricker 1958); Fry (1947) devel maximum sustained yield was just beginning oned the virtual population idea; and Schaefen to really catch on. Of course, the ideas had (1954) proposed his method for estimating already been around for quite a while. Ba- surplus production under nonequilibrium conrenzes (1918) was the first to combine infar, ditions. The literature crackled with new mation on growth and abundance to develop information and new ideas. The solidification a catth equation, and Russell (1931) and of the concept of MSY, its application to Graham (1935) brought the dynamic pool fisheries here, there, and everywhere, was just model to the forefront, but they were working under way. World fisheries catch was a mere from a base of natural history and fishery 20 million tons, and there were signs in lots biology that had been growing for several of places of irreligious practices such as har-Acades

conservation movement was in full cry and coupled with determination to do it properly, fisheries, like other resources, were being illo- the FAO emerged as a major actor in the minated in the glow of the Gospel of Efficiency international fisheries scene. (Have 1969). In dogens of states and prov- It was in consetuence of this flowering of inces, fish and game regulations were pro- activity that the graduate students of those liferated, commercial fisheries were increas- days had a missionary zeal about them, and an ingly documented, and there was a growing more than one wit has said. "They had a fine awareness of the necessary scientific base for vocabulary of stained glass language," Briefly, management. Thermoson and Bell (1934) the darma was this: any species each year came to the conclusion that too much fishing produces a harvestable surplus, and if you take effort was at the heart of the halibut problem: that much, and no more, you can so on setting Hile (1996) readuced his classic on the cisco is forever and ever (Amen). You only need to in Wisconsin: and the first steps were being have as much effect as is necessary to catch taken to restore the Fraser River sockeye from this magic amount, so to use more is wasteful the effects of overfishing and the Hell's Gate of effort; to use less is wasteful of food. Basiblockages

The ten years following World War II were the golden age for the concept of maximum costained yield. Bicker (1948) produced his

\*Keynote address to the American Fisherics Society Annual Meetings, Deacherr, Michigan, September 19-54, 1956

vesting more or less than should be harvested By the late 1930s, in North America, the In a mood of environment about opportunities,

> cally, it was a peritarical philosophy in which the supreme powers were pretty harsh or people who enjoyed themselves rather than doing precisely the Right Thing. Armed with scientific knowledge about the number of fishermen and technological advances, the

- MSY was developed in the early 1930s, and adopted in the 1950s by several international organizations and individual countries
- Larkin PA (1977) An epitaph for the concept of maximum sustained yield outlines deficiencies of MSY
  - monospecific dynamical model (no trophic relationships)
  - scalar dynamical model
    - no spatial variability
    - no age structure
    - no reproductive status

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- steady state approach
- only benefits, no costs

Though being accused of having led to the collapse of many fisheries, the MSY remains the reference till now

- Accused of having led to the collapse of many fisheries
- Incorporated into the 1982
   United Nations Convention for the Law of the Sea
- Following the World Summit on Sustainable Development (Johannesburg, 2002), the signatory States undertook to restore and exploit their stocks at MSY
- About a quarter of world fisheries are overexploited in the sense that stocks are less than the MSE, the stock size that supports MSY

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# We introduce the rent or profit, which depends on price and costs

The economic rent or profit Rent(h, B) is



where

- p price per unit of harvested biomass ("price-taker")
- Cost(h, B) harvesting costs

# The private property equilibrium (PPE) maximizes the profit

- Among all sustainable equilibria on the curve h = Sust(B)
- the private property equilibrium (PPE) is the one achieving the maximal rent

$$ext{Rent}(h_{ ext{PPE}}, B_{ ext{PPE}}) = \max_{B \geq 0, \ h = ext{Sust}(B)} ext{Rent}(h, B)$$

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# The common property equilibrium (CPE) makes the profit zero

- The assumption is that, when a resource is in open access, any positive rent is dissipated as newcomers exhaust it
- Among all sustainable equilibria on the curve h = Sust(B)
- the common property equilibrium (CPE) is the one that makes the rent zero

 $ext{Rent}(h_{ ext{CPE}}, B_{ ext{CPE}}) = 0$  and  $h_{ ext{CPE}} = ext{Sust}(B_{ ext{CPE}})$ 

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# Let us consider the case where the cost is linear in the effort

• Catches are supposed to be linear in an effort variable



• Assume harvest costs of the form



- q catchability coefficient
- c unit cost of effort

• 
$$\operatorname{Rent}(h,B) = ph - \operatorname{Cost}(h,B) = \left(p - \frac{c}{qB}\right)h$$

# We derive the common property equilibrium (CPE) in the linear effort costs case

$$\operatorname{Rent}(h,B) = \left(p - \frac{c}{qB}\right)h$$

### High price-to-cost ratio drives biomass to collapse

$$B_{\text{CPE}} = rac{c}{pq} = rac{1/q}{\sum\limits_{\text{price to cost ratio}} \infty rac{1}{ ext{price}/ ext{cost}}$$

- The common property equilibrium B<sub>CPE</sub> does not depend upon the biological dynamics Biol
- Conservation problem if high price-to-cost ratio:
   cost c ↘ (sonar, satellite) or price p ↗ (scarcity) ⇒ B<sub>CPE</sub> ↘ 0

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# Exercise: compute MSE and PPE when the biological dynamics is a Beverton-Holt function

- Consider the biological Beverton-Holt dynamics  $Biol(B) = \frac{RB}{1+bB}$
- The sustainable yield is

$$\operatorname{Sust}(B) = B - \frac{B}{R - bB}$$
 for  $0 \le B \le K = \frac{R - 1}{b}$ 

• The MSE achieves the maximum of Sust, that is,

$$\frac{d \operatorname{Sust}(B)}{dB}_{|B=B_{\mathrm{MSE}}} = 0 \iff 1 - \frac{R}{(R-bB)^2} = 0$$
MSE biomass is
$$B_{\mathrm{MSE}} = \frac{R - \sqrt{R}}{b}$$

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### Here stands the Beverton-Holt PPE

• The sustainable yield is

$$\texttt{Sust}(B) = B - \frac{B}{R - bB}$$
 for  $0 \le B \le K = \frac{R - 1}{b}$ 

• The PPE achieves the maximum of the rent, that is,

$$rac{d}{dB}_{|B=B_{ ext{PPE}}}\left((p-rac{c}{qB})\operatorname{Sust}(B)
ight)=0$$

Show that the sign of the above derivative is positive at B = B<sub>MSE</sub>
The PPE is

$$B_{\rm PPE} = \frac{R - \sqrt{R - \frac{b}{q} / \frac{p}{c}}}{b}$$

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# There is more biomass at equilibrium under private property equilibrium than under maximum sustainable equilibrium

$$B_{ ext{PPE}} = rac{R - \sqrt{R - rac{b}{q}/rac{p}{c}}}{b} > B_{ ext{MSE}} = rac{R - \sqrt{R}}{b}$$

•  $B_{\rm PPE} > B_{\rm MSE} \Longrightarrow$  more biomass at equilibrium

- under private property equilibrium
- than under maximum sustainable equilibrium
- To the first-order, we have that

$$B_{
m PPE} - B_{
m MSE} \propto 1/rac{p}{c} = rac{c}{p} = rac{
m cost}{
m price}$$

# MSE, PPE, CPE for blue whale



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# The Aboré marine reserve dilapidation illustrates the "Tragedy of the Commons" / open access



- In August 1993, in New Caledonia the Aboré marine reserve has been re-opened to fishing
- The reserve had been closed during three years
- The benefits of these three years were dissipated in a few weeks

 Resources in open access suffer from over-exploitation

## Open access dynamics displays CPE equilibrium

• We consider the open access dynamics

$$\begin{cases} B(t+1) = Biol(B(t) - Catch(E(t), B(t))) \\ E(t+1) = E(t) + \alpha Rent(Catch(E(t), B(t)), E(t)) \\ \hline \\ \end{array}$$

Peru's fishing overcapacity highlights the point that this model assumes a too flexible effort adaptation

• Gordon's bionomic equilibrium CPE is  $B_{\rm CPE} = \frac{c}{pq}$  when

• catches 
$$Catch(E,B) = qEB$$
,

• rent Rent(h, E) = ph - cE

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# Summary

- The maximum sustainable yield (MSY) is the maximum surplus production that can be harvested in perpetuity without altering the stock level
- Though being accused of having led to the collapse of many fisheries, the MSY remains the reference till now
- The private property equilibrium (PPE) maximizes the profit
- The common property equilibrium (CPE) makes the profit zero
- Open access dynamics displays CPE equilibrium

#### 🚺 Equilibrium

- Definition of equilibrium (under constraint)
- Examples of equilibria
- 2 Sustainable yield and related notions
  - Sustainable yield for surplus model
  - Maximum sustainable equilibrium
  - Private property equilibrium
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  - Definition of stability of an equilibrium state
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# Open loop stability of an equilibrium

The dynamics around an equilibrium  $x_{\rm E}$  with the fixed equilibrium decision  $u_{\rm E}$  is

$$\left\{ egin{array}{l} x(t+1) = {\tt Dyn}(x(t),u_{\scriptscriptstyle 
m E}) \ x(t_0) = x_0 pprox x_{\scriptscriptstyle 
m E} \end{array} 
ight.$$

#### Attractive equilibrium

Equilibrium  $x_{\rm E}$  is attractive if there exists a neighborhood  $\mathcal{N}(x_{\rm E})$  of  $x_{\rm E}$  such that

$$\lim_{t \to +\infty} x(t) = x_{ ext{\tiny E}} \ , \quad orall x_0 \in \mathcal{N}(x_{ ext{\tiny E}})$$

The property that an equilibrium is attractive does not depend of the transitory phase  $x(t_0), x(t_0 + 1), \ldots, x(T)$ 

# The concept of asymptotic stability combines transitories and asymptotics properties

#### Asymptotically stable equilibrium

The equilibrium  $x_{\rm E}$  is said to be asymptotically stable when any trajectory x(t),  $t = t_0, t_0 + 1, ...$ , starting close enough to  $x_{\rm E}$  ( $x(t_0) \approx x_{\rm E}$ )

- remains in the vicinity of  $x_{\rm E}$  ( $x(t) \approx x_{\rm E}$ ,  $t = t_0, t_0 + 1, ...$ ): stability concerns transitories
- and converges towards x<sub>E</sub> (x(t) → x<sub>E</sub>): attractivity only focuses on asymptotics

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#### Summary

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As a starter, we highlight stability of the zero equilibrium for scalar linear systems

- Scalar  $x(t) \in \mathbb{R}$
- A dynamical linear scalar system has the form

x(t+1) = Mx(t) where  $M \in \mathbb{R}$ 

- The solution has the expression  $x(t) = M^{t-t_0}x(t_0)$ 
  - |M| > 1
  - |M| < 1</p>
  - |*M*| = 1

#### Proposition

Equilibrium  $x_{E} = 0$  is asymptotically stable if and only if |M| < 1

#### Stability for dynamical linear systems

# P. H. Leslie introduced mortality-natality matrix models in forestry

VOLUME XXXIII, PART III NOVEMBER 1945 ON THE USE OF MATRICES IN CERTAIN POPULATION MATHEMATICS Br P. H. LESLIE, Barsas of Animal Papalation, Oxford University 183 13. The approach to the stable age dis-194 select-Derivation of the matrix elements Superior enample
 Troperior of the basic matrix 14. Special case of the matrix with only a 2. Transformation of the co-ordinat 15. Numerical comparison with the natal and en ion between the manufal form 16. Further practical applications Ascendia - (i). The tables of mertality and Properties of the stable vectors . It Doubter of the rate of The spectral set of spendors . it. Reduction of A to classical resources (2) Sumerical values of the The relation between p and p yestors matrix elements 12. Case of repeated latent scots . . . . . . 1. INTRODUCTION If we are given the age distribution of a population on a certain date, we may require to know the are distribution of the survivors and descendants of the original population at successive intervals of time, successing that these individuals are subject to some given are specific rates of fertility and mertality. In order to simplify the problem as much as possible. it will be assumed that the age specific rates remain constant over a period of time, and the female population alone will be considered. The initial age distribution may be entirely arbitrary; thus, for instance, it might consist of a geoup of females confined to only one of The method of computing the female population in one unit's time, given any arbitrary age distribution at time t, may be expressed in the form of m+1 linear constions, where m to m + 1 is the last age group considered in the complete life table distribution, and when the same unit of age is adopted as that of time. If  $n_{ee}$  = the number of females alive in the are group o to a + 1 at time  $t_i$  $E_{i}$  = the probability that a female aged z to z + 1 at time 1 will be alive in the age group x+1 to x+2 at time (+1.  $T_{c}$  = the number of daughters bern in the interval (to 1+1 per female alive agod z to z+1) at time t, who will be alive in the age group 0-1 at time t+1, then, working from an origin of time, the age distribution at the end of one unit's interval will be given by ∑*Fe*ter − tu Peter - Pa  $P_1 n_{10} = n_{11}$  $P_i \pi_{ik} = \pi_{ik}$ Parthers - Pas

N(t+1) = L N(t)



Leslie, P.H. (1945) "The use of matrices in certain population mathematics" Biometrika, 33(3), 183–212

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The stability of the nul equilibrium of a linear system is related to the location of eigenvalues with respect to the unit disk

• Vector  $x(t) \in \mathbb{R}^n$  and dynamical linear system

$$x(t+1) = \underbrace{M}_{\text{square matrix}} x(t)$$

• Eigenvalues  $\lambda_i(M)$  of the square matrix M

Theorem

Equilibrium  $x_{\rm E} = 0$  is asymptotically stable if and only if all eigenvalues have modulus strictly less than unity, that is,

$$\underbrace{\lambda_i(M)}_{\text{organization}} \mid < 1 , \quad \forall i$$

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# The dynamics of the increments is (almost) linear

$$\begin{aligned} x(t+1) &= & \text{Dyn}(x(t), u_{\text{E}}) \\ x_{\text{E}} &= & \text{Dyn}(x_{\text{E}}, u_{\text{E}}) \\ & \downarrow \\ \underbrace{x(t+1) - x_{\text{E}}}_{\text{increment}} &= & \text{Dyn}(x_{\text{E}} + \underbrace{x(t) - x_{\text{E}}}_{\text{increment}}, u_{\text{E}}) - \text{Dyn}(x_{\text{E}}, u_{\text{E}}) \\ &= & \frac{\partial \text{Dyn}}{\partial x}(x_{\text{E}}, u_{\text{E}})\underbrace{(x(t) - x_{\text{E}})}_{\text{increment}} + \cdots \end{aligned}$$

# The Jacobian matrix provides the linear part of a nonlinear dynamics

$$\frac{\partial \text{Dyn}}{\partial x}(x_{\text{E}}, u_{\text{E}}) = \begin{pmatrix} \frac{\partial \text{Dyn}^{1}}{\partial x_{1}}(x_{\text{E}}, u_{\text{E}}) & \frac{\partial \text{Dyn}^{1}}{\partial x_{2}}(x_{\text{E}}, u_{\text{E}}) & \cdots & \frac{\partial \text{Dyn}^{1}}{\partial x_{n}}(x_{\text{E}}, u_{\text{E}}) \\ \vdots & \vdots & \ddots & \vdots \\ \frac{\partial \text{Dyn}^{n}}{\partial x_{1}}(x_{\text{E}}, u_{\text{E}}) & \frac{\partial \text{Dyn}^{n}}{\partial x_{2}}(x_{\text{E}}, u_{\text{E}}) & \cdots & \frac{\partial \text{Dyn}^{n}}{\partial x_{n}}(x_{\text{E}}, u_{\text{E}}) \end{pmatrix}$$
  
ere  $\text{Dyn}(x, u) = \begin{pmatrix} \text{Dyn}^{1}(x_{1}, x_{2}, \dots, x_{n}, u) \\ \vdots \\ \text{Dyn}^{n}(x_{1}, x_{2}, \dots, x_{n}, u) \end{pmatrix}$ 

wh

# Stability of an equilibrium can often be deduced from linearization of the dynamics at the equilibrium

#### Theorem

Assume that the dynamics Dyn is a continuously differentiable mapping on a neighborhood of the equilibrium  $(x_E, u_E)$ . Then,

$$\forall i \;,\; |\underbrace{\lambda_i(rac{\partial \mathtt{Dyn}}{\partial x}(x_{\mathrm{E}}, u_{\mathrm{E}}))}_{\mathrm{eigenvalue}}| < 1 \implies x_{\mathrm{E}} \; asymptotically \; stable$$

for the nonlinear dynamical system

$$x(t+1) = Dyn(x(t), u_{\scriptscriptstyle ext{E}})$$

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#### Summary

# Exercise: study stability when the biological dynamics is a Beverton-Holt function

• We consider the Schaefer model

$$B(t+1)=rac{R(B(t)-h_{ ext{E}})}{1+b(B(t)-h_{ ext{E}})}= ext{Dyn}(B(t),h_{ ext{E}})$$

built upon the Beverton-Holt biological dynamics

• Equilibrium: 
$$h_{
m E}=B_{
m E}-rac{B_{
m E}}{R-bB_{
m E}}$$

• Exercise: compute  $\frac{\partial \text{Dyn}(B,h_{\text{E}})}{\partial B}|_{B=B_{\text{E}}} = \frac{\partial}{\partial B}|_{B=B_{\text{E}}} [\frac{R(B-h_{\text{E}})}{1+b(B-h_{\text{E}})}] = (\frac{R-bB_{\text{E}}}{\sqrt{R}})^2$ 

Asymptotic stability if

 $B_{\text{MSE}} < B_{\text{E}} \leq K$ 

- MSE at frontier between stability and unstability
- PPE is a stable equilibrium
- CPE can be unstable

# Blue whale: CPE versus PPE





 $p = 7\ 000\$  per BWU

50 100 150 200



CPE equilibrium: unstability

250 PPE equilibrium: stability

300

350 400 450 500

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The red trajectory corresponds to the MSE

# We show that, in a simple open access model, instability and extinction occur

$$\begin{cases} B(t+1) &= \operatorname{Biol}(B(t) - qE(t)B(t)) \\ E(t+1) &= E(t) + \alpha \left( pqE(t)B(t) - cE(t) \right) \\ &= \operatorname{Dyn}^{E}(B(t), E(t)) \end{cases}$$

The Jacobian matrix at equilibrium  $(B_{\rm E}, E_{\rm E}) = (\frac{c}{pq}, E_{\rm E})$  is

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# In the linear biological dynamics case, the eigenvalues of the Jacobian matrix are outside the stability disk

• Assuming a linear biological dynamics Biol(B) = RB, the Jacobian matrix is

$$\left(\begin{array}{cc} R(1-qE_{\rm E}) & -RqB_{\rm E} \\ \alpha pqE_{\rm E} & 1 \end{array}\right) = \left(\begin{array}{cc} 1 & -\frac{Rc}{p} \\ \alpha p\frac{R-1}{R} & 1 \end{array}\right)$$

• The two eigenvalues  $(\lambda_1,\lambda_2)$  are

$$\begin{cases} \lambda_1 = 1 - i\sqrt{\alpha c(R-1)} \\ \lambda_2 = 1 + i\sqrt{\alpha c(R-1)} \end{cases}$$

• Stability cannot be guaranteed since  $|\lambda_i|^2>1$ 

# Biomass and effort trajectories display oscillations and divergence



#### Examples

# We consider a dynamical model of n species in competition for the same resource

$$N_{i}(t+1) = N_{i}(t) + \Delta_{t} \left( N_{i}(t) \underbrace{(f_{i}R(t) - d_{i})}_{\text{intrinsic growth}} \right)$$
$$R(t+1) = R(t) + \Delta_{t} \left( \underbrace{S - aR(t)}_{\text{intrinsic growth}} - \sum_{i=1}^{n} \underbrace{w_{i}f_{i}R(t)N_{i}(t)}_{\text{interaction}} \right)$$

- $\Delta_t$  time unit
- N<sub>i</sub>(t) density of species i
- R(t) resource for which all species compete
- $f_i R(t)$  growth,  $d_i$  death rates of species i
- S aR(t) natural growth rate of the resource (S a stationary input)

Examples

# The competitive exclusion principle states that only one species survives

• If  $\Delta_t$  is small enough, a positive stable equilibrium is (Tilman, 1988)

$$\begin{cases}
R_{\rm E} = \min_{i=1,\dots,n} \frac{d_i}{f_i} = \frac{d_{i_{\rm E}}}{f_{i_{\rm E}}} \\
N_{i,{\rm E}} = \begin{cases}
\frac{S_{\rm E} - R_{\rm E} \partial}{R_{\rm E} w_i f_i} & \text{if } i = i_{\rm E} \\
0 & \text{if } i \neq i_{\rm E}
\end{cases}$$

• Only species  $i_{\rm E}$  survives: this is the competitive exclusion principle

# Competitive exclusion principle

Densities trajectories



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# Summary

- Asymptotic stability tackles both transitories and asymptotics
- The stability of the nul equilibrium of a linear system is related to the location of eigenvalues with respect to the unit disk
- Local stability can often be deduced from linearization of the dynamics at the equilibrium

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### Summary

- Equilibrium analysis is the basics of natural resource management relying upon biomass models: sustainability=equilibrium
- Though being strongly criticized, the maximum sustainable yield (MSY) remains the reference till now
- Three equilibria are worth being distinguished
  - maximum sustainable equilibrium (MSE)
  - private property equilibrium (PPE)
  - common property equilibrium (CPE)
- Stability is important for conservation issues, to avoid biomass collapse
- Stability analysis relies upon the study of the linearized dynamics at equilibrium