

**EMERGENCE OF UNIQUE  
PARAMETRIC DEPENDENCE  
IN AN EPIDEMIC MODEL.**

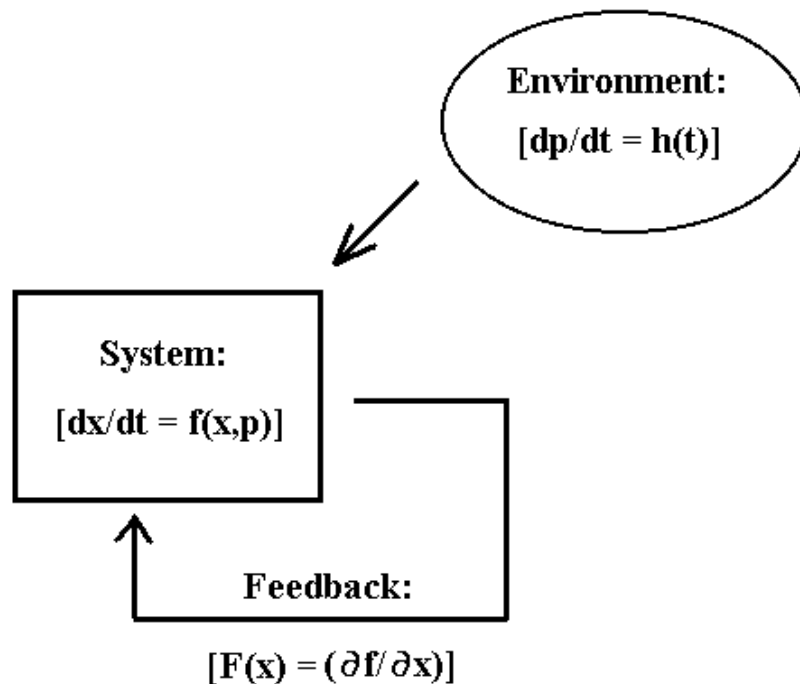
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04/05/05

# Dynamical Systems.

- **Mathematical objects** used to model the *time evolution* of real-world systems.



- Regardless of application, we inevitably distinguish **system** from **environment**.
- Environment may or may not change with time, but in either case is **unaffected** by state of the system.

## Dynamical Systems (continued).

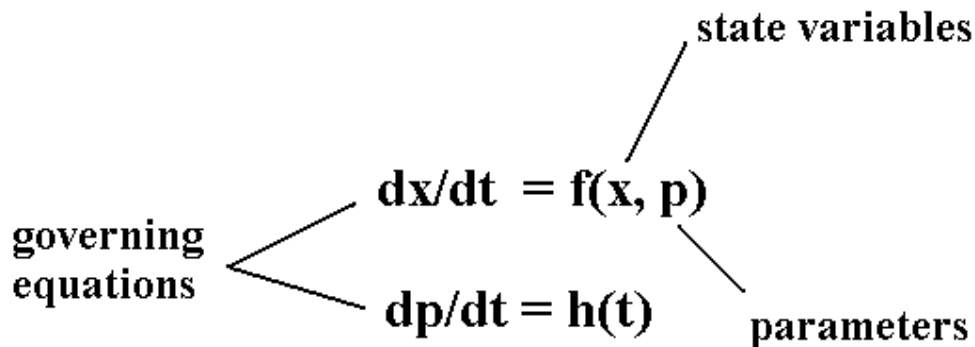
- Time evolution of a dynamical system determined **jointly** by the environment and **internal feedback**.<sup>1</sup>
- Dynamical systems can be categorized in many ways:
  1. **Continuous** *vs.* **discrete**.
  2. **Autonomous** (constant parameters) *vs.* **non-autonomous** (time-varying parameters).<sup>2</sup>
  3. **Finite** dimensional *vs.* **infinite** dimensional.
  4. **Conservative** *vs.* **dissipative**.
  5. **Deterministic** *vs.* **stochastic**.

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1. Distinguishing system from environment: straight-forward **in principle**; often difficult **in practice**.

2. Non-autonomous systems are equivalent to **higher dimensional** autonomous systems

## Representative Dynamical System.



- **Governing equations** “determine” the motion.
- **State variables** are the quantities that “evolve.” Collectively, they specify the **state** of the system.
- **Parameters** encapsulate the environment.
- Parameter values can change with time, but their time evolution is **unaffected** by the state of the system.

## Studying Dynamical Systems.

- **Two Complementary Approaches.**

1. Study the time evolution of the **system state**,  $(x(t), y(t), \dots)$  for **fixed** parameter values.

2. Study the birth / death of **attractors** and **other invariant sets** as one varies parameters.

- In the first case, one works in **phase space**; in the second, in **parameter space**.

- A good example of the way in which these approaches complement each other provided by the **complex logistic map**

$$Z_{i+1} = Z_i^2 + C , \quad (1)$$

where  $Z$  and  $C$  are complex numbers.

## Mandelbrot / Julia Sets.

- Governing equation can be rewritten as

$$\begin{aligned} X_{i+1} &= F(X_i, Y_i, P, Q) \\ Y_{i+1} &= G(X_i, Y_i, P, Q) \end{aligned} \tag{2}$$

- For every pair (P,Q) of parameter values,  $\exists$  an **attractor** at  $(X, Y) = (-\infty, -\infty)$ .
- For some (P,Q)  $\exists$  also a *finite-valued attractor* (FVA) – a **fixed point** or a **cycle**.
- Each FVA has a **basin of attraction** (BA) in the X-Y plane. The boundary of the BA is called a **Julia set**,  $J$ .
- The **set of (P,Q) values** for which there **exists an FVA** is called  $M$ , so named by Benoit Mandelbrot.<sup>3</sup>

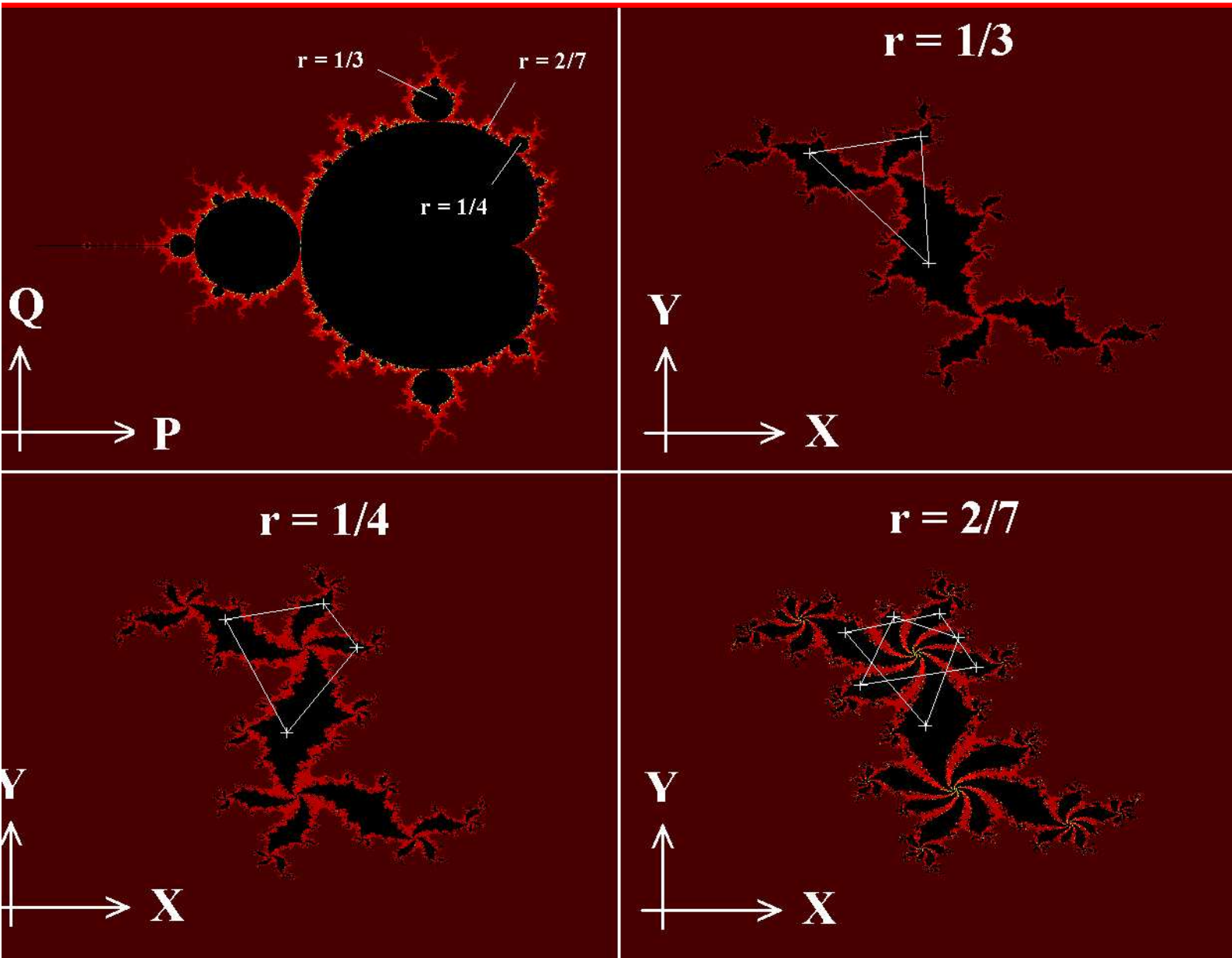
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3. With (P,Q) on the boundary of  $M$ ,  $J$  is a fractal.

## Mandelbrot / Julia Sets (continued).

- Each FVA can be characterized by its **rotation number**,  $\rho = n/m$ , where
  1.  $m$  = number of points on the cycle;
  2.  $n$  = number of  $2\pi$  rotations required to visit all of them.
- $M$  consists of an infinite number of **connected regions** (the “balls”) corresponding to FVAs of **different** rotation numbers.
- The regions are ordered (as one moves along the margin of  $M$ ) according to the **Farey Sequence** (see below).
- *Modulo* the existence of the attractor at infinity, Eqs (2) manifest **unique parametric dependence** (UPD) – for each (P,Q) there is **one and only one** FVA.

# Mandelbrot / Julia Sets (continued).

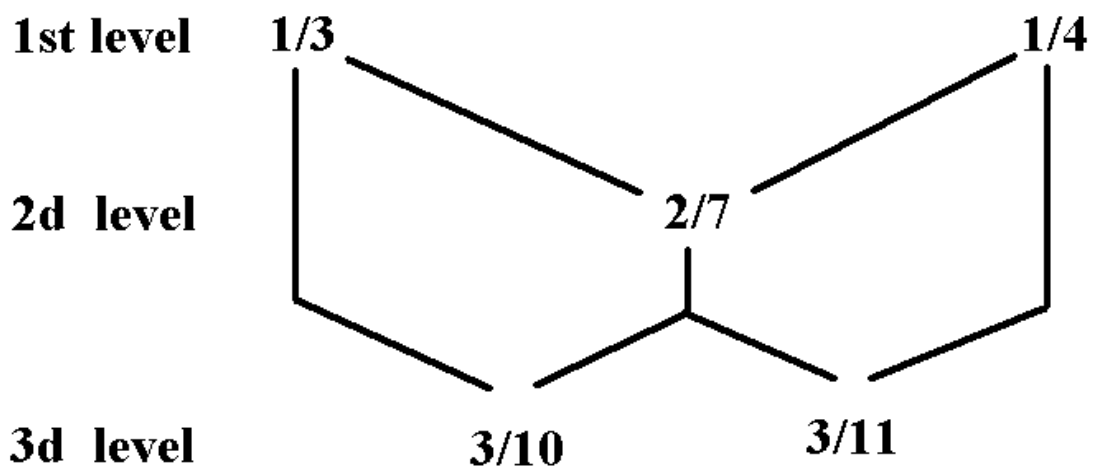


## Note on Farey Sequences.

- A way of constructing the **real** numbers from the **rationals**.
- Successive **levels** of the **Farey tree** constructed via **Farey addition**,  $\oplus$ :

$$\frac{n}{m} \oplus \frac{p}{q} = \frac{n+p}{m+q} \quad (3)$$

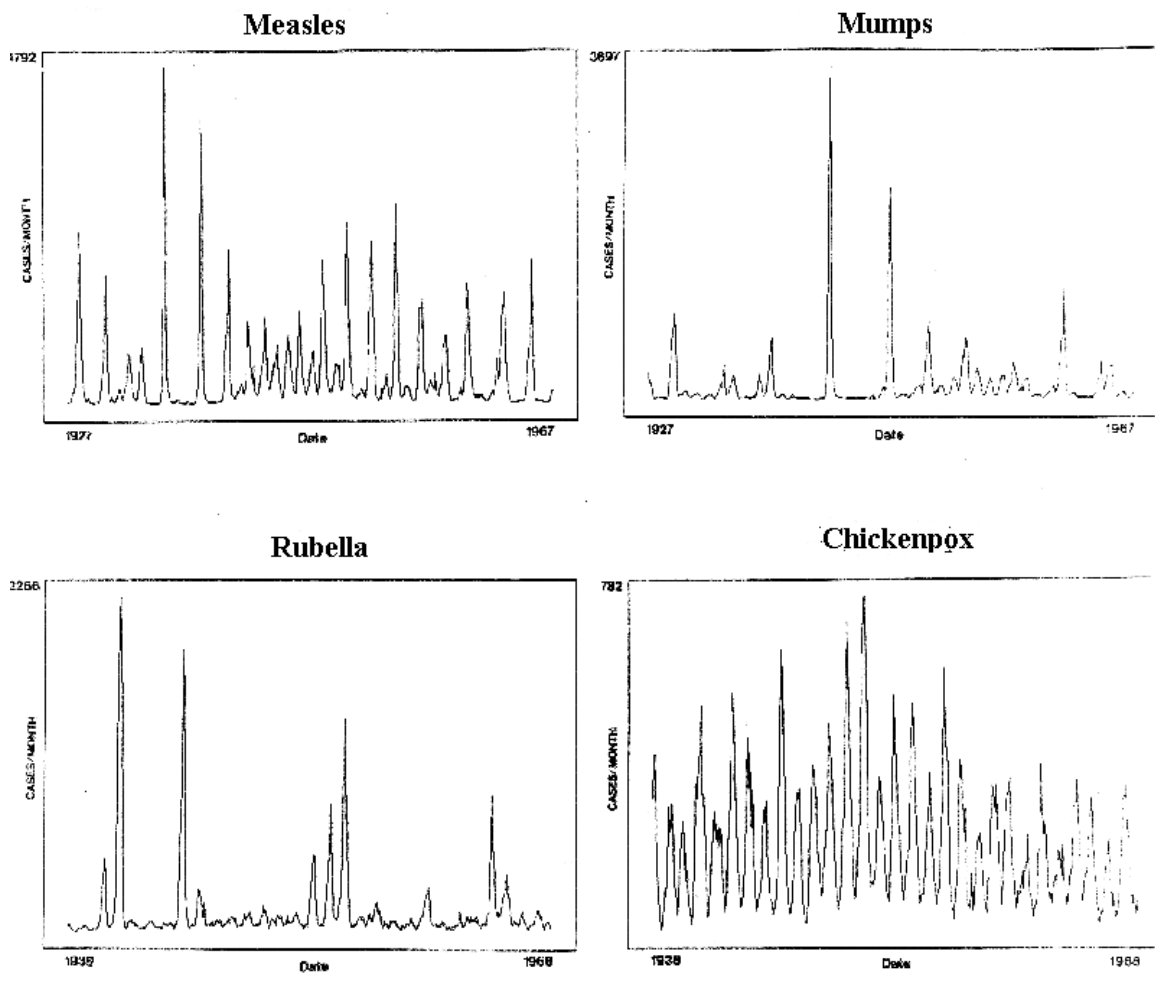
### Farey Sequence Construction



# Childhood Diseases.

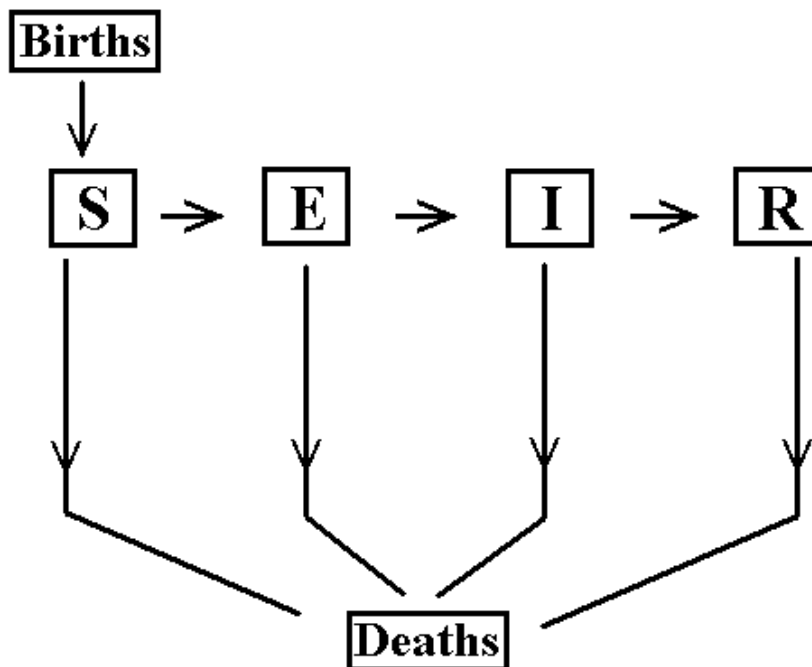
- **Chickenpox, measles, mumps, rubella.**
- Diverse dynamics ranging from **annual** to **biennial** cycles to **putative chaos**.

## Copenhagen Notifications (1928-1967).



## SEIR Equations.

- Appropriate for **microparasitic** infections.
- Categorize host individuals according to disease status:
  1. **Susceptible**;
  2. **Exposed** (but not yet infectious);
  3. **Infectious**;
  4. **Recovered** (and immune).



## SEIR Equations (continued).

- **Typical Implementation:**
  1. **Constant** population size.
  2. **Quadratic** transmission ( $\propto S \times I$ ).
  3. **Linear** transitions from **E** to **I** & **I** to **R**.
  4. **Seasonal variations** in transmission – “school year effect” – modeled as simple trig function.
  
- **Thus,**

$$\begin{aligned}\dot{S} &= m(N - S) - B(t)SI \\ \dot{E} &= B(t)SI - (m + a)E \\ \dot{I} &= aE - (m + g)I\end{aligned}\tag{4a}$$

- **where**

$$B(t) = B_0(1 + \varepsilon_B \cos 2\pi t)\tag{4b}$$

## SEIR Equations (continued).

- **Parameters** interpreted as follows:

$N$	host population size;
$m^{-1}$	host life expectancy;
$a^{-1}$	mean latency period;
$g^{-1}$	mean infectious period;
$B_0$	mean contact rate;
$\varepsilon_B$	seasonal variation in contact rate.

- Eqs (4a) often **non-dimensionalized** by substituting

$$s = S/N; \quad e = E/N; \quad i = I/N; \quad \beta_0 = B_0 N \quad (4c)$$

- **Yields**

$$\begin{aligned} \dot{s} &= m(1-s) - \beta(t)si; & \dot{e} &= \beta(t)si - (m+a)e \\ \dot{i} &= ae - (m+g)i; & \beta(t) &= \beta_0(1 + \varepsilon_B \cos 2\pi t) \end{aligned} \quad (4d)$$

## Autonomous SEIR Dynamics.

- **Two equilibria:**

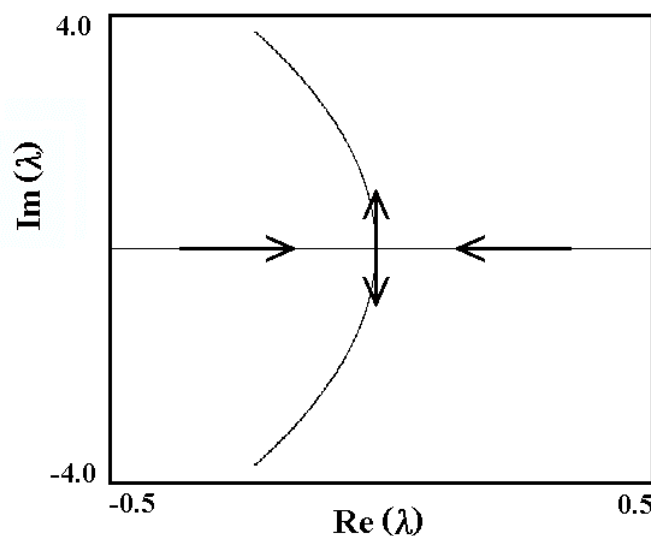
1. No disease state:  $(N, 0, 0)$ .
2. Endemic state:  $(S^*, E^*, I^*)$ .

- **Transcritical bifurcation at**

$$R_0 = \frac{aB_0N}{(m+a)(m+g)} \approx \frac{B_0N}{g} = 1 \quad (5)$$

**stabilizes  $I^*$  as it passes through 0.**

- Thereafter, two of the eigenvalues **complexify**  $\rightarrow$  damped oscillations.



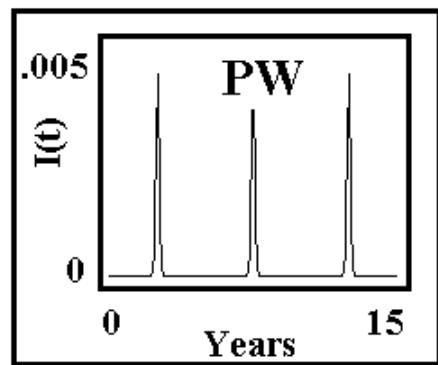
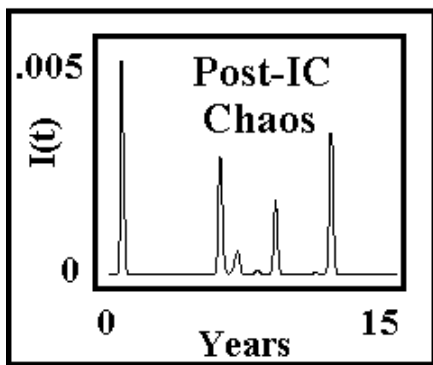
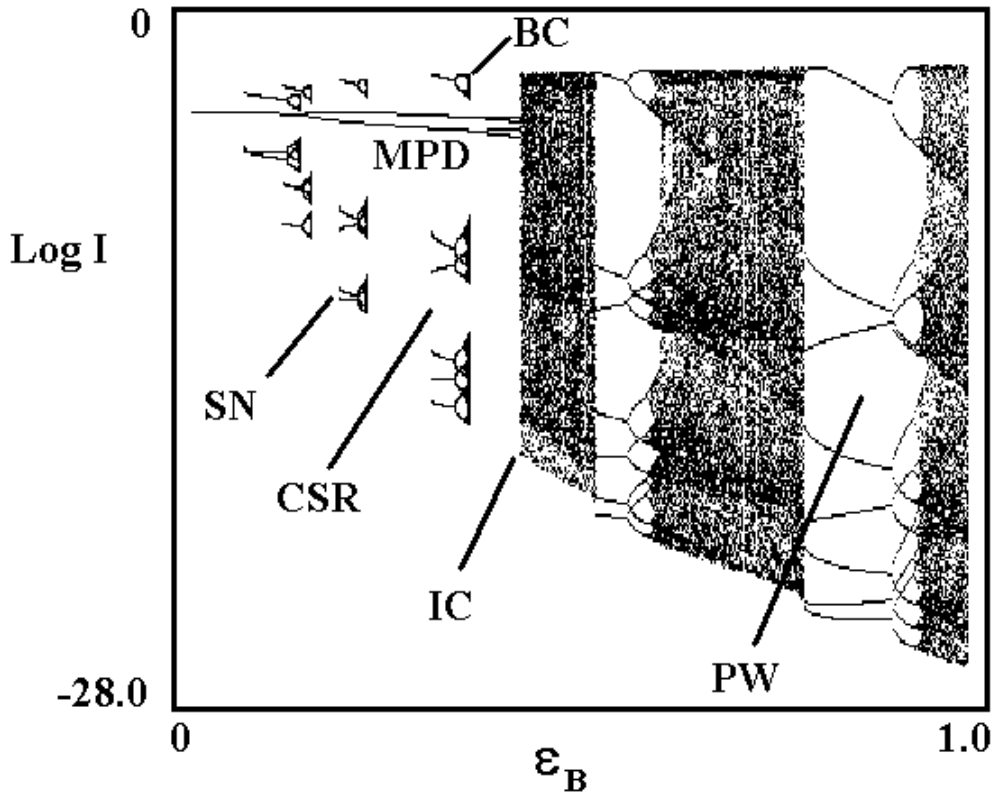
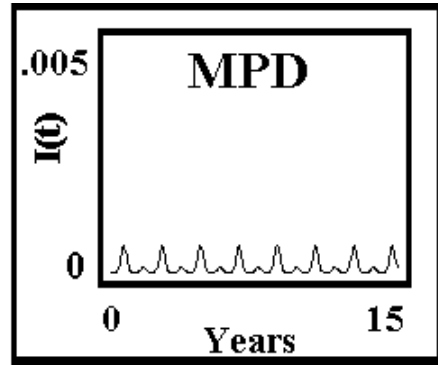
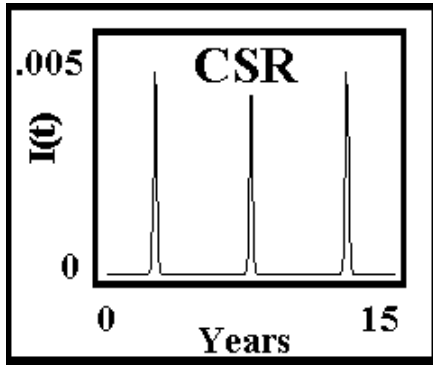
## Non-Autonomous Dynamics.

- **Wide range** of behaviors:
  1. **Annual cycles** and modulations thereof.
  2. **Multi-annual** cycles (1 peak per cycle).
  3. **Transient and asymptotic chaos**.
- Bifurcation diagrams (asymptotic dynamics<sup>4</sup> vs.  $B_0$  or  $\varepsilon_B$ ) often manifest:
  1. **Main period-doubling** (MPD) route.
  2. **Coexisting subharmonic resonances** (CSRs) before the IC.
  3. **Interior crisis** (IC) on MPD.
  4. **Period windows** (PW) in the main sequence *after* the IC.
- **Chaotic saddles** (not shown) also coexist with the MPD before the IC.

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4. Trajectories sampled **stroboscopically**, *i.e.*, at intervals equal to period of forcing. This is a convenient way of discretizing continuous trajectories in presence of periodic forcing.

$$\beta_0 = 1500.$$



## **Non-Autonomous Dynamics.**

- **MPD attractors**

1. **Modulations** of the annual cycle.
2. Manifest **period-doubling** to chaos.

- **CSRs**

1. Produced in pairs (one stable, one not) by **saddle-node bifurcations** (SN).
2. Stable cycles undergo their own sets of **period-doublings**.
3. CSR attractors destabilized by **boundary crises** (BC) whereat they collide with their basin boundaries.

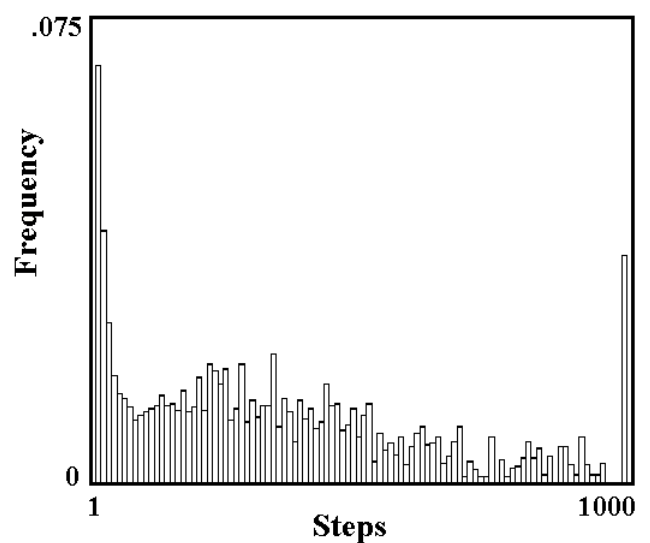
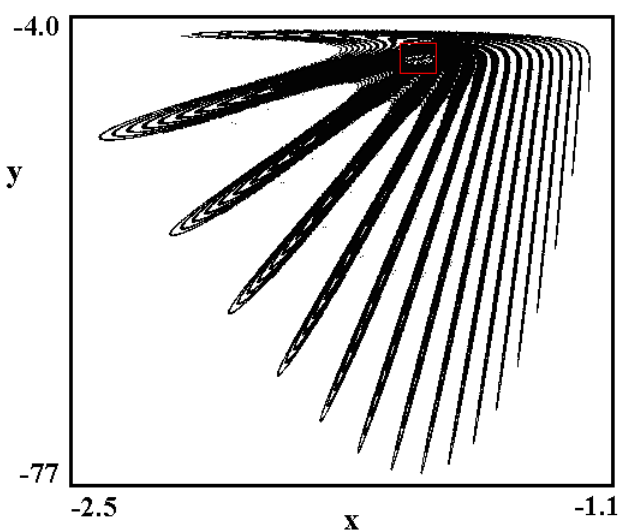
- **IC**

1. Results from **collision** of MPD attractor with destabilized CSR.
2. Produces **qualitative change** in MPD dynamics.

- **Chaotic saddles** (CS) also coexist with the MPD before the IC.

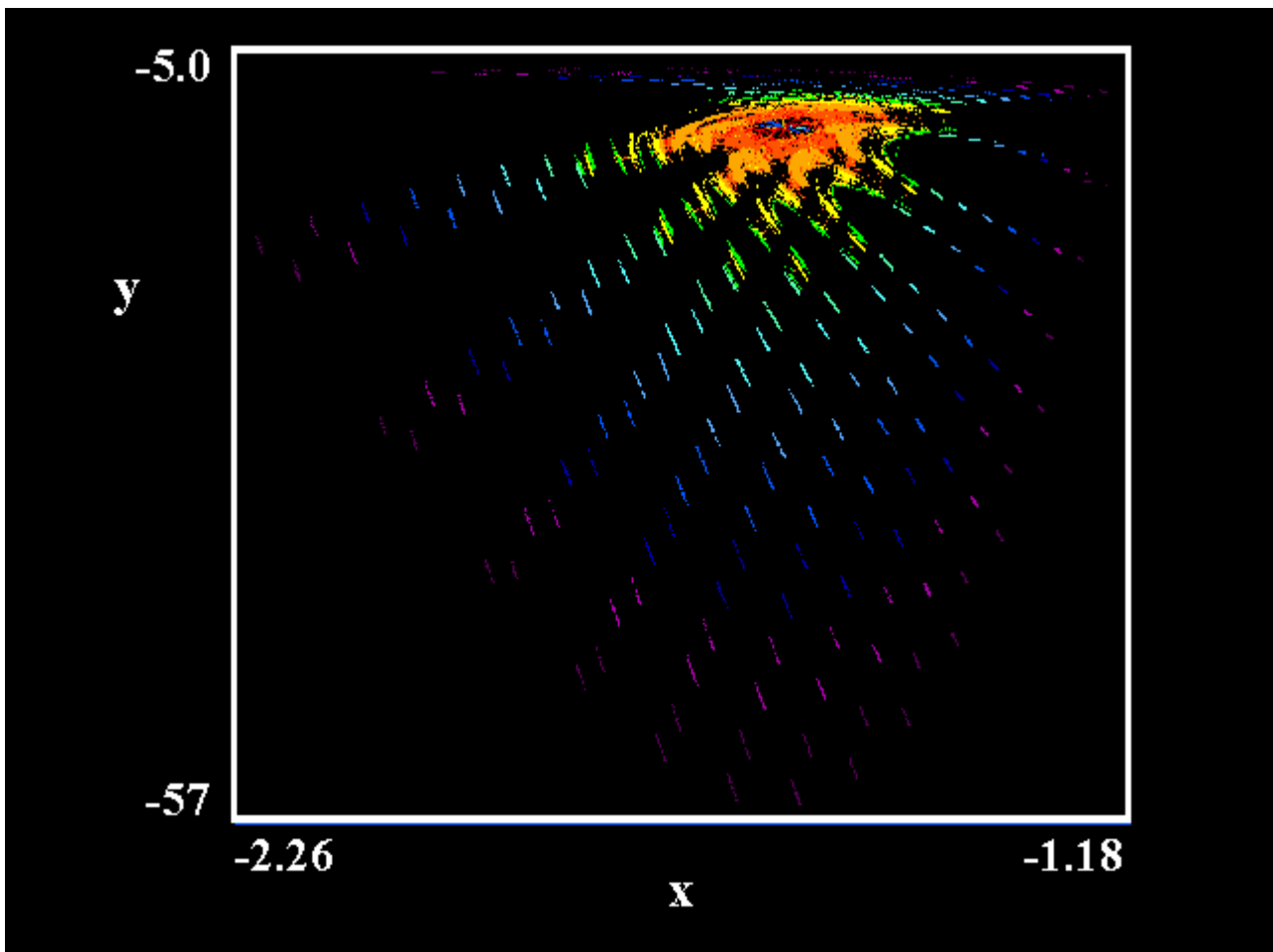
## Transient Chaos.

- Consequence of **chaotic saddles** that result from destabilization of CSRs via BCs.
- Even though all orbits **eventually** terminate on the MPD attractor, they can spend considerable time **shadowing** the chaotic saddle before settling down.
- **Organized** about “skeletons” of non-stable periodic points.



## Transient Chaos (continued).

- Color-coding recurrent points on the CS allows one to visualize a few of the **periodic points** and their **stable manifolds**.<sup>5</sup>

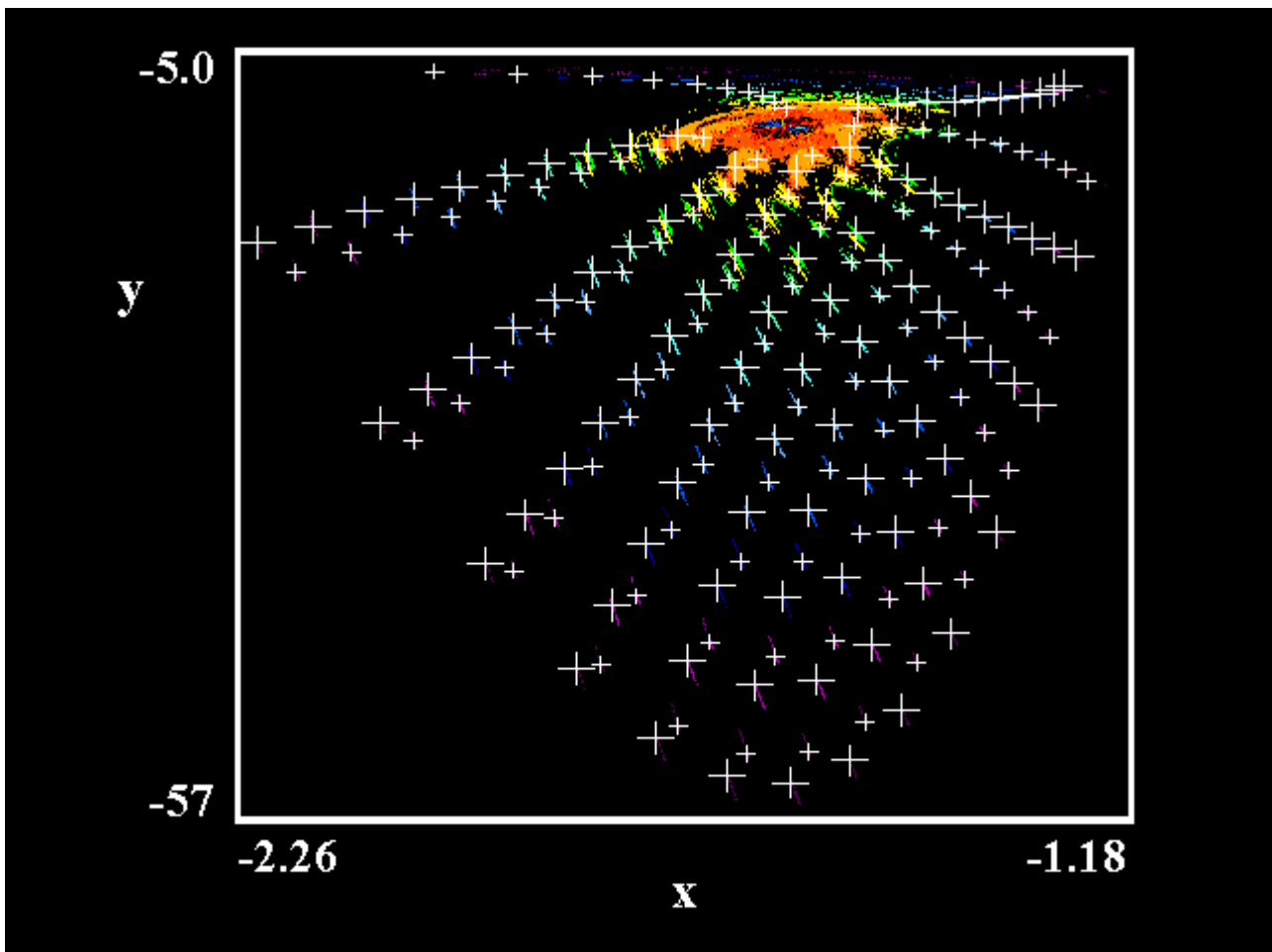


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**5.** Stable (unstable) manifolds are **nonlinear continuations** of the **linear spaces** spanned by the stable (unstable) eigenvectors of a fixed or periodic point.

## Transient Chaos (continued).

- Color-coding recurrent points by **mean peak-to-peak interval** =  $1/\rho$ . Subharmonic cycles with  $\rho = 1/14, \dots, 1/3$  superposed. ( $B_0 = 500$ ;  $\varepsilon_B = 0.25$ .)

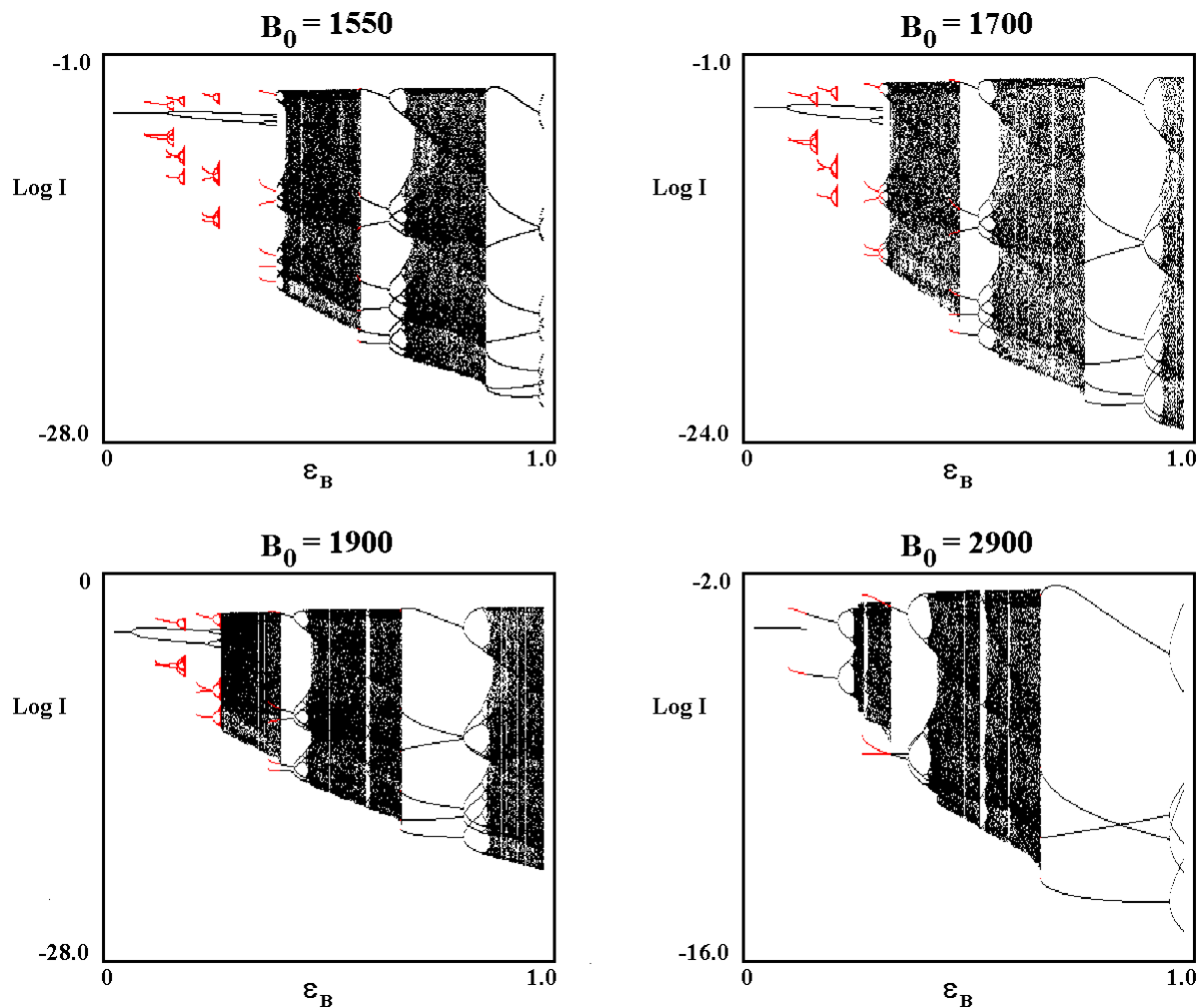


## Emergence of Parametric Uniqueness.

- With increasing  $B_0$ , the CSRs move to the **right** and are **incorporated** into the MPD.
- Incorporation **begins** when the BC that terminates a CSR bifurcation sequence **coincides** with the IC on the MPD.
- Incorporation **concludes** when the SN that begets the CSR coincides with the IC.
- Between these two values of  $B_0$ , the CSR bifurcation sequence is **partly on** and **partly off** the MPD.

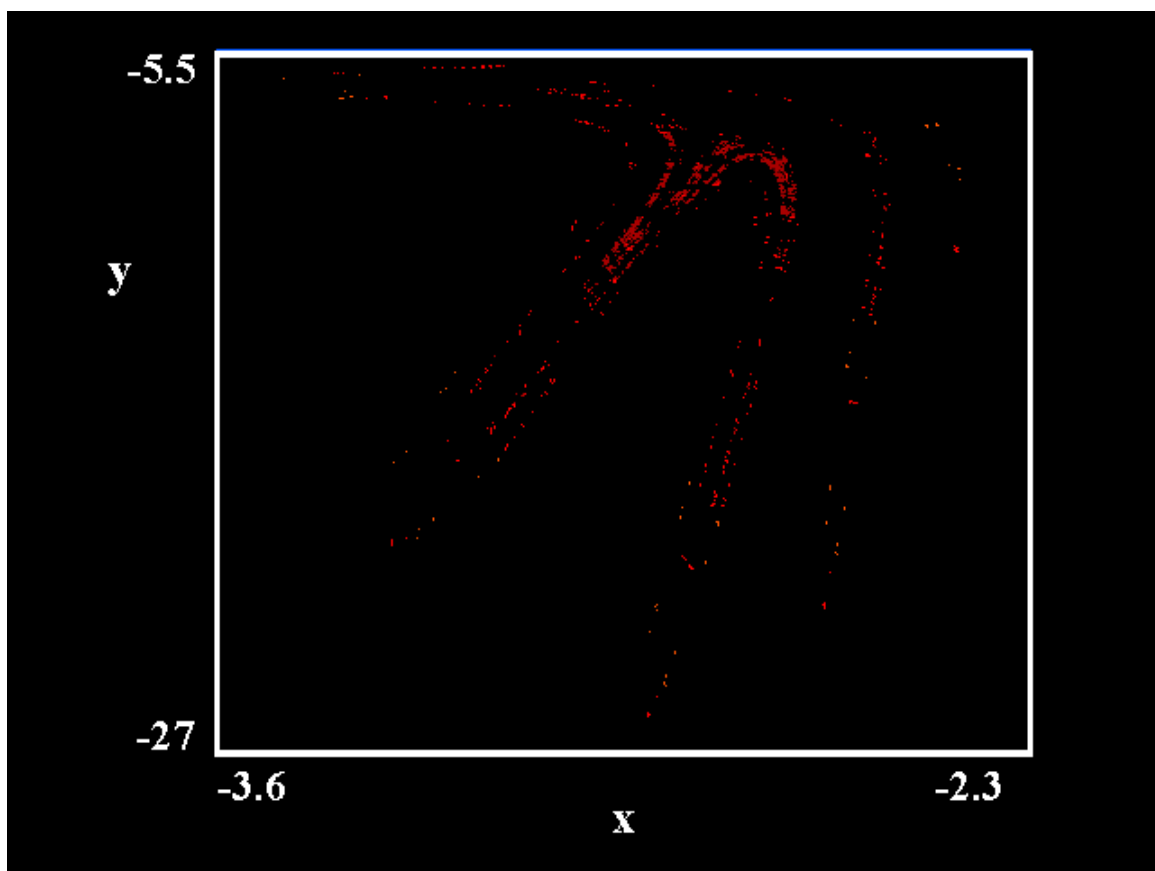
# Parametric Uniqueness (continued).

## Incorporation of CSR Bifurcation Sequences into MPD Sequence. (Coexisting attractors shown in red)



## Chaotic Saddle Simplification.

- Emerging parametric uniqueness **simplifies** transient chaos – CS **loses** frequencies.

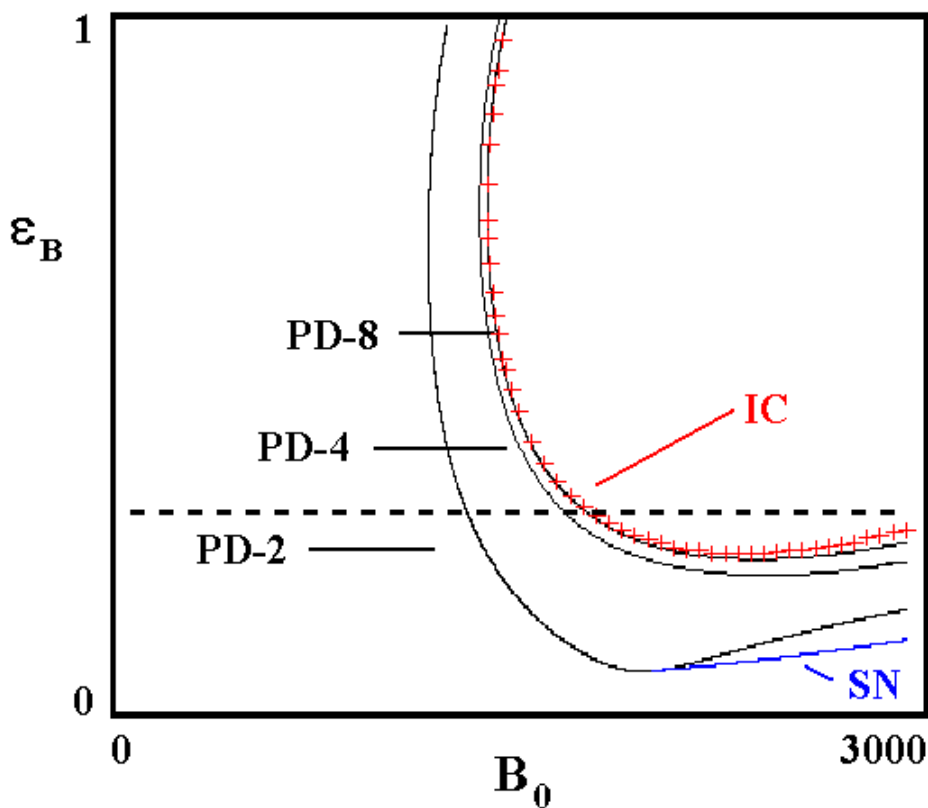


Chaotic saddle color-coded by mean peak-to-peak period (dark red = 1; dark purple, 14) for  $B_0 = 1800$ ;  $\varepsilon_B = 0.27$ . Compare with previous pictures.

## Two Parameter Analysis.

- Continue period-doubling and saddle-node bifurcations **numerically** in  $B_0$ - $\varepsilon_B$  plane.
- Compute loci of interior and boundary crises by **brute force** inspection.

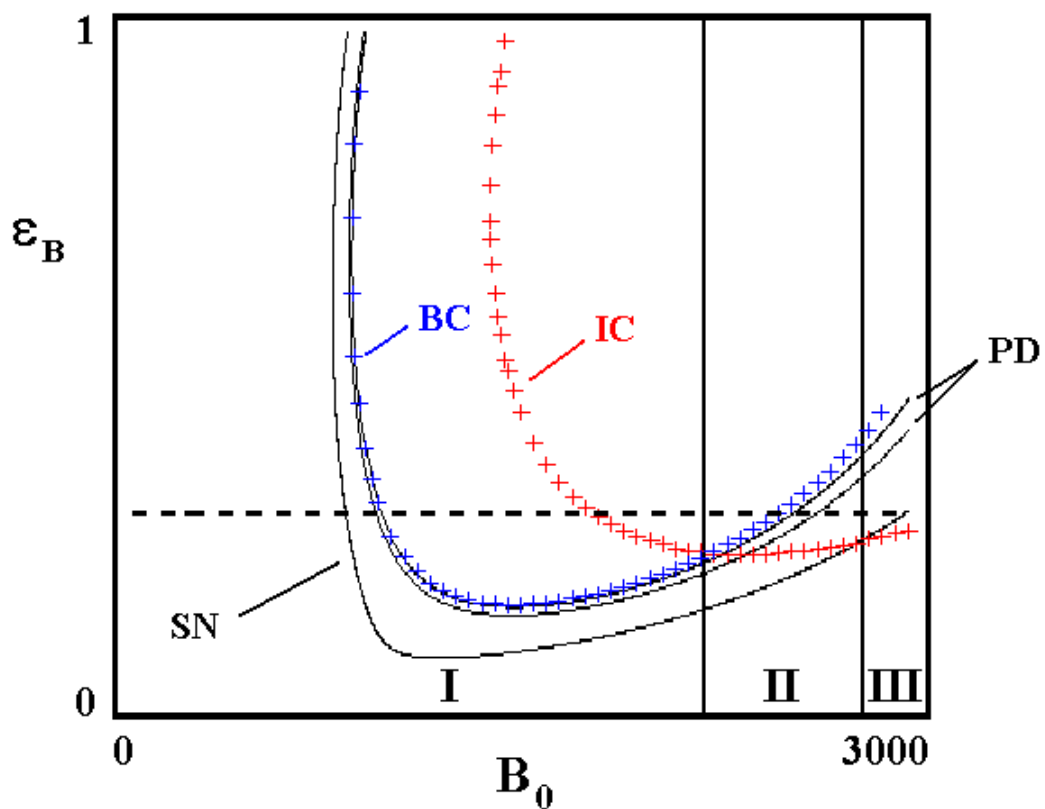
### MPD Bifurcations.



## Two Parameter Analysis (continued).

- SN curves delimit **resonance horns** within which all invariant sets have same  $\rho$ .
- Superposing BC / IC curves shows **initiation / conclusion** of CSR incorporation.

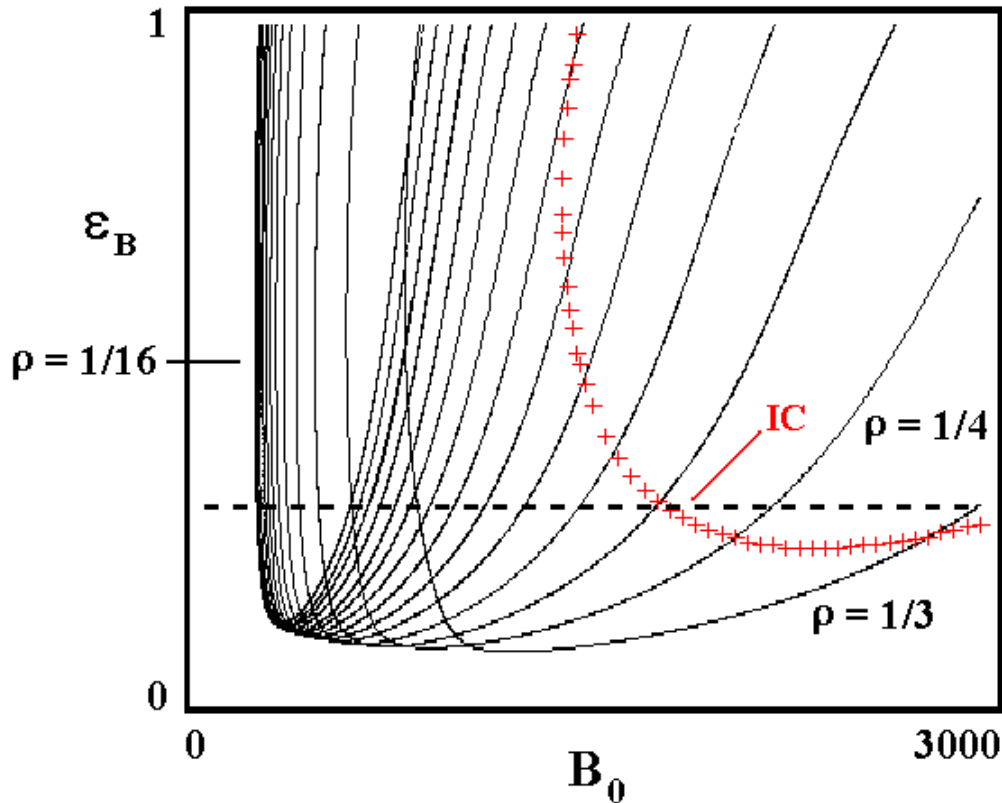
**$\rho = 1/3$  Resonance Horn.**



## Two Parameter Analysis (continued).

- SN-IC and BC-IC intersections permit **division** of parameter plane into 3 regions:
  - I. CSR entirely **off** the MPD .
  - II. CSR entirely **on** the MPD.
  - III. CSR partly on and partly off the MPD.
- Intersections are effectively **codimension 2** bifurcations in the sense that they can be continued by varying  $B_0$ ,  $\varepsilon_B$  and a third parameter –  $a$  ,  $g$  or  $m$ .
- Displaying multiple SN curves and the IC curve indicates
  1. **Accumulation** of (an infinite number?) of CSRs at a critical value of  $B_0$  (left).
  2. **Sorting out** of 1<sup>st</sup> level Farey sequence CSRs by rotation number in response to increasing  $B_0$ .
  3. **Origin** of and post-IC **sequence** of periodic windows within the MPD.

## Two Parameter Analysis (continued).



- An apparently **infinite** number of resonance horns accumulate at  $B_0 \approx 200$ .
- With increasing  $B_0$ , one **exits** high period resonance horns, and **enters** (and then exits) horns of lower period.
- Intersections of SN and IC curves mark incorporation of CSRs into MPD.

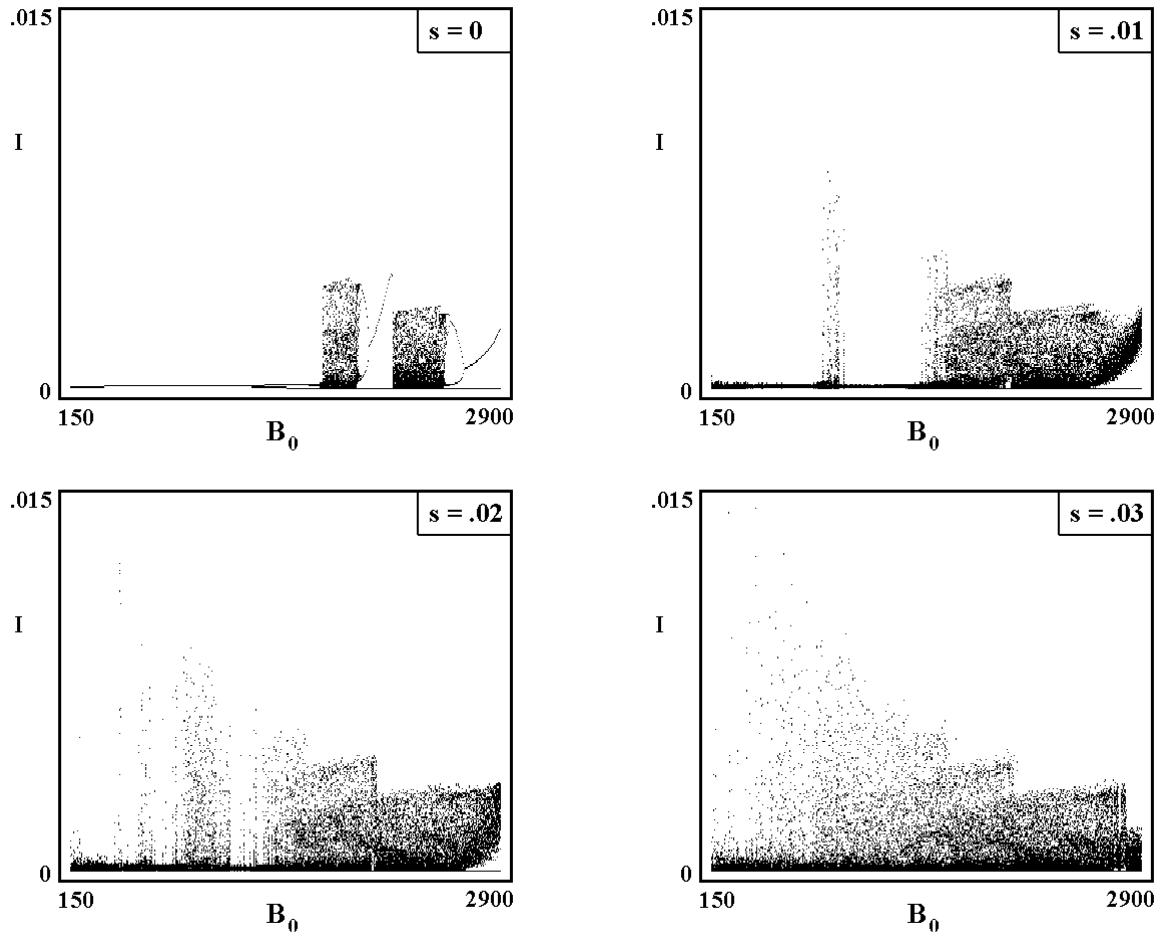
## Conclusions.

- Emergence of UPD in response to increasing values of  $B_0$ , reflects increasing **dissipation** (“friction”) as indicated by increasing negativity of the divergence of the vector field, *i.e.*,

$$\frac{d}{dB_0}(\text{div } F) = -I \quad (6)$$

- Similar result previously hold for seasonal predator-prey models.
- $\exists$  a **trade-off** between the complexity of **transient** and **asymptotic** dynamics – *i.e.*, with increasing dissipation, CSRs move off the CS and into the MPD.
- $\rightarrow$  Noise-mediated reversal (NMR) of parametric dependency – *i.e.*, qualitatively **different** bifurcation diagrams obtain with and without noise.

# Noise Mediated Reversal of Parametric Dependency.



Bifurcation diagrams corresponding to dashed line in previous figures computed in the presence of increasing levels of multiplicative noise:  $S$ ,  $E$ ,  $I$ , replaced by  $S(1+u)$ , *etc.*, where  $u$  is uniformly distributed on  $[-s, s]$  as shown. In the absence of noise, dynamical complexity increases with  $B_0$ . With  $s = .03$ , the pattern is reversed.

## Conclusions (concluded).

- Mumps, rubella and chickenpox have values of  $B_0$  roughly **half** that of measles.
  1. **Accounts** for **mix** of annual and multi-annual cycles in **mumps** and **rubella**.
  2. Does **not** account for absence of multi-annual cycling in **chickenpox**.