

Current Trends in Dynamical Systems  
and the Mathematical Legacy of Rufus Bowen

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# Natural Invariant Measures

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## Outline of talk

- I. SRB measures -- from Axiom A to general diffeomorphisms
- II. Conditions for existence and statistical properties of SRB measures
- III. A class of “strange attractors” and some concrete examples
- IV. Extending the scope of previous work, to infinite dim, random etc.

# Part I. SRB measures: from Axiom A to general D.S.

## SRB measures for Axiom A attractors (1970s)

$M =$  cpct Riem manifold,  $f =$  map or  $f_t =$  flow

Assume uniformly hyperbolic or Axiom A attractor

A very important discovery of Sinai, Ruelle and Bowen is that these attractors have a special invariant prob meas  $\mu$  with the following properties:

(1) (time avg = space avg)

$$\frac{1}{n} \sum_{i=0}^{n-1} \varphi(f^i x) \rightarrow \int \varphi d\mu \quad \underline{\text{Leb-a.e. } x} \quad \text{for all cts observables}$$

(2) (characteristic  $W^u$  geometry)  $\mu$  has conditional densities on unstable manifolds

(3) (entropy formula)

$$h_\mu(f) = \int \log |\det(Df|E^u)| d\mu$$

Moreover, (1)  $\iff$  (2)  $\iff$  (3)

Proofs involves  
Markov partitions &  
connection to stat mech

Next drop Axiom A assumption.

## How general is the idea of SRB measures ?

$M =$  cpct Riem manifold,  $f =$  arbitrary diffeomorphism or flow

Recall: properties of SRB measures in Axiom A setting:

(1) time avg = space avg, (2) characteristic  $W^u$  geometry, (3) entropy formula

**Theorem** [Ledrappier-Strelcyn, L, L-Young 1980s]

Let  $(f, \mu)$  be given where  $\mu$  is an arbitrary invariant Borel prob.

Then (2)  $\iff$  (3); more precisely:

$(f, \mu)$  has pos Lyap exp a.e. and  $\mu$  has densities on  $W^u$

$$\iff h_\mu(f) = \int \sum_i \lambda_i^+ m_i d\mu \quad \text{where } \lambda_i \text{ are Lyap exp} \\ \text{with multiplicities } m_i$$

We defined SRB measures for general  $(f, \mu)$  by (2).

Note: Entropy formula proved for volume-preserving diffeos (Pesin, 1970)

Entropy inequality ( $\leq$ ) proved for all  $(f, \mu)$  (Ruelle, 1970s)

# What is the meaning of all this?

For **finite dim** dynamical systems, an often adopted point of view is

**observable events = positive Leb measure sets**

For **Hamiltonian systems**,

Liouville measure = *the* important invariant measure

Same for volume preserving dynamical systems

But what about “**dissipative**” systems, e.g., one with an attractor ?

Suppose  $f : U \rightarrow U$ ,  $f(\bar{U}) \subset U$ , and  $\Lambda = \bigcap_{n=0}^{\infty} f^n(U)$

Assume  $f$  is volume decreasing.

Then  $\text{Leb}(\Lambda) = 0$ , and all inv meas are supported on  $\Lambda$   
i.e., no inv meas has a density wrt Leb

This does not necessary imply no inv meas can be **physically relevant**  
= reflecting the properties of Lebesgue

Here is how it works:

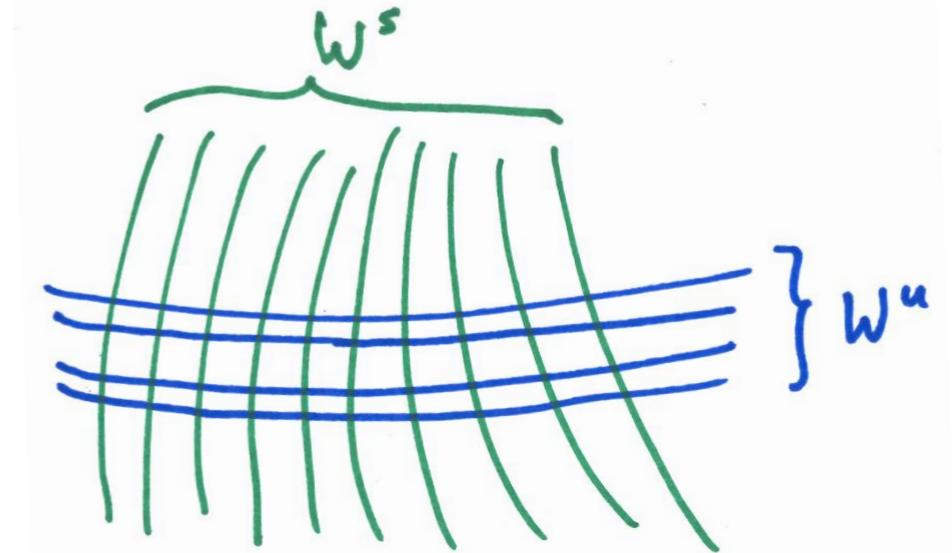
$\mu$  has densities on  $W^u$  together with

$$\text{if } \bar{\varphi}(x) = \lim_{n \rightarrow \infty} \frac{1}{n} \sum_0^n \varphi(f^i x)$$

$$\text{then } \bar{\varphi}(x) = \bar{\varphi}(y) \quad \forall y \in W^s(x)$$



integrating out along  $W^s$ , properties on  $W^u$  passed to basin



Crucial to this argument is the **absolute continuity of the  $W^s$  foliation**  
proved in nonuniform setting [Pugh-Shub 1990]

To summarize :

- **one way to define *SRB meas for general*  $(f, \mu)$  is**  
**pos Lyap exp + conditional densities on  $W^u$  i.e. property (2)**
- **conditional densities on  $W^u$  implies *physical relevance***  
**under assumptions of ergodicity and no 0 Lyap exp i.e. property (1)**

And how is the entropy formula related to all this ?



entropy comes from expansion

but not all expansion goes into making entropy

Ruelle's entropy inequality

conservative case: no wasted expansion

Pesin's entropy formula

But whether entropy = sum of **pos** Lyap exp,

what does that have to do with backward-time dynamics?

Entropy formula holds iff system is **conservative in forward time**

= an interpretation of SRB measure

Meaning of gap in Ruelle's Inequality:

**Theorem** [Ledrappier-Young, 1980s]  $(f, \mu)$  as above; assume ergodic for simplicity.

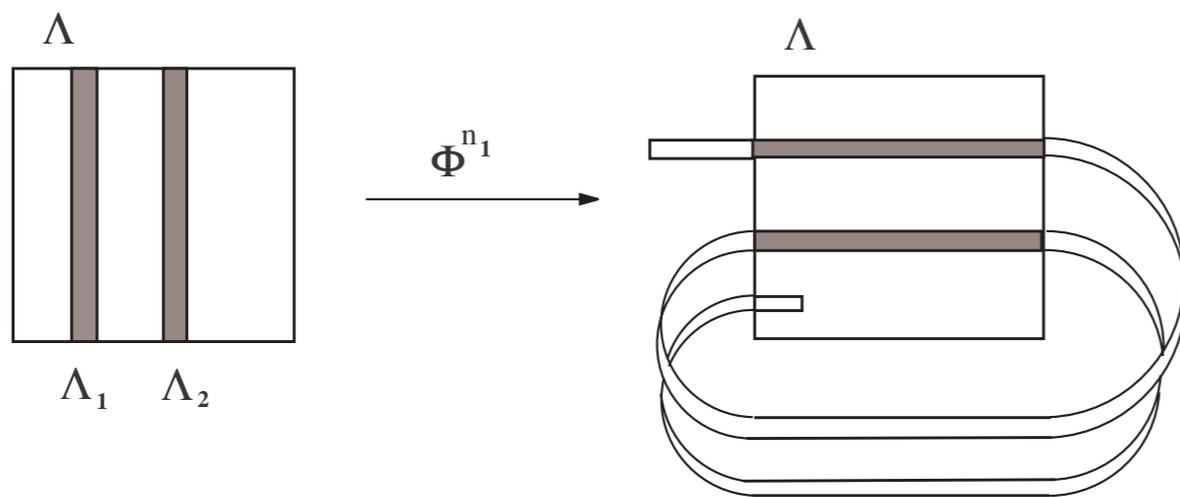
Then 
$$h_\mu(f) = \sum_i \lambda_i^+ \delta_i$$
 where  $\delta_i \in [0, \dim E_i]$  is the dimension of  $\mu$  "in the direction of  $E_i$ "

Interpretation:  $\dim(\mu|W^u) = \sum \delta_i$  is a measure of dissipativeness

# Part II. SRB meas: conditions for existence & stat properties

A difference between results for Axiom A and general diffeos is that  
no existence is claimed

A natural condition that guarantees existence



Start with a reference box,  
or a stack of  $W^u$ -leaves,  
or a stack of surfaces roughly  $\parallel$  to  $W^u$   
or just one such surface

Keep track of “good” returns to ref set  
“good” = stretched all the way across  
with unif bounded distortion

Let  $R$  = return time  
 $m$  = Leb meas in  $E^u$

**Prop** [Young 80s] **If**  $\int R dm < \infty$ , **the SRB meas exists.**

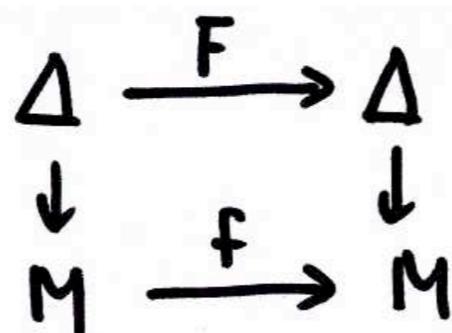
Most SRB meas (outside of Axiom A) were constructed this way.

First time I used it: piecewise unif hyperbolic maps of  $\mathbb{R}^2$  [Young, 1980s]

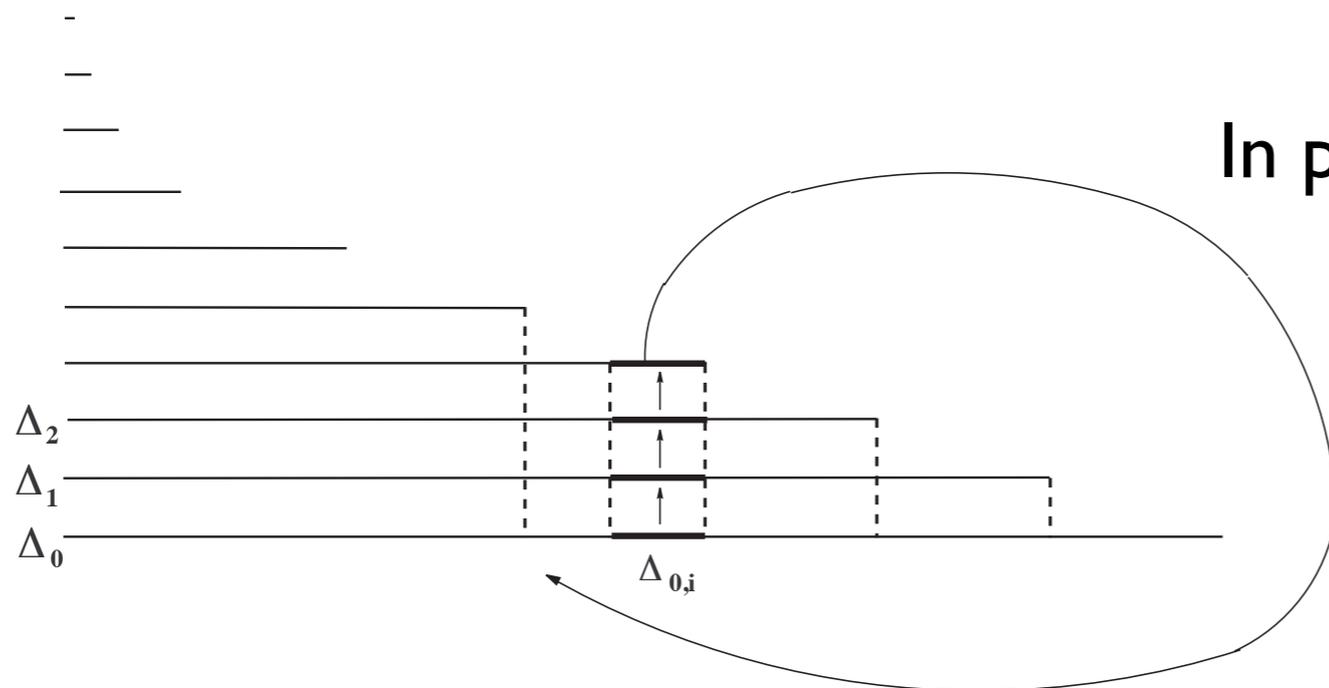
In the same spirit that (finite) Markov partitions facilitated the study of statistical properties of Axiom A systems, I proposed (1990s) that

- (1) stats of systems that admit *countable Markov extensions* can be expressed in terms of their renewal times, and
- (2) this may provide *a unified view* of a class of nonuniformly hyperbolic systems that have “controlled hyperbolicity”

By (1), I mean  
given  $f$ , seek



s.t.  $(F, \Delta)$  has a countable Markov partition



In practice, fix a reference set  $\Lambda_0$  with hyperbolic (product) structure.  
Build skyscraper until  
“good return”

**“dynamical renewal”**

## Theorem [Young, 90s]

Suppose  $f$  admits a Markov extension with return time  $R$ ,  $m = \text{Leb}$ ,

(a) If  $\int R dm < \infty$ , then  $f$  has an SRB meas  $\mu$

(b) If  $m\{R > n\} < C\theta^n$ ,  $\theta < 1$ , then  $(f, \mu)$  has exp decay of correl

(c) If  $m\{R > n\} = O(n^{-\alpha})$ ,  $\alpha > 1$ , then decay  $\sim n^{-\alpha+1}$

(d) If  $m\{R > n\} = O(n^{-\alpha})$ ,  $\alpha > 2$ , then CLT holds.

Idea is to *swap messy dynamics for a nice space w/ Markov structures*

Construction of Markov extension was carried out for several known examples  
e.g.

**Theorem [Young, 1990s]** Exponential decay of time correlations  
for collision map of 2D periodic Lorentz gas

**Remarks** 1. Important progress in hyperbolic theory is the understanding  
that *deterministic chaotic systems* produce stats very similar to  
those from (random) *stochastic processes*

2. Above are conditions for natural inv meas & their statistical properties.

To check these conditions, *need some degree of hyperbolicity* for the dyn sys

## Part III. Proving positivity of Lyap exp in systems w/out inv cones

Major challenge even when there is a lot of expansion

Reason : where there is expansion, there is also contraction ...

$$v_0 = \text{tangent vector at } x, \quad v_n = Df_x^n(v_0)$$

$\|v_n\|$  sometimes grows, sometimes shrinks

cancellation can be delicate

A breakthrough, and an important paradigm:

### Theorems

$$f_a(x) = 1 - ax^2, \quad a \in [0, 2]$$

1. [Jakobson 1981] There is a positive meas set of  $a$  for which

$f_a$  has an invariant density and a pos Lyap exp.

2. [Lyubich; Graczyk-Swiatek 1990s] Parameter space  $[0, 2] = \mathcal{A} \cup \mathcal{B} \pmod{\text{Leb } 0}$

s.t.  $\mathcal{A}$  is open and dense and  $a \in \mathcal{A} \implies f_a$  has sinks

$\mathcal{B}$  has positive meas and  $a \in \mathcal{B} \implies f_a$  has acim & pos exp

Intermingling of opposite dynamical types makes it impossible to determine pos Lyap exp from finite precision or finite # iterates

Next breakthrough: **The Henon maps** [Benedicks-Carleson 1990]

$$T : \mathbb{R}^2 \rightarrow \mathbb{R}^2, \quad T_{a,b}(x, y) = (1 - ax^2 + y, bx)$$

[BC] devised (i) an inductive algorithm to identify a “critical set”, and  
(ii) a scheme to keep track of derivative growth for points that do not approach the “critical set” faster than exponentially

Borrowing [BC]’s techniques:

**Theorem** [Wang-Young 2000s] [technical details omitted]

**Setting** :  $F_{a,\varepsilon} : M \circlearrowleft$  where  $M = \mathbb{S}^1 \times D_m$  (m-dim disk)  
 $a$  = parameter,  $\varepsilon^m$  = “determinant” (dissipation)

**Assume**

1. singular limit defined, i.e.  $F_{a,\varepsilon} \rightarrow F_{a,0}$  as  $\varepsilon \rightarrow 0$
2.  $f_a = F_{a,0}|(\mathbb{S}^1 \times \{0\}) : \mathbb{S}^1 \circlearrowleft$  has “enough expansion”
3. nondegeneracy + transversality conditions

**Then for all suff small**  $\varepsilon > 0$  ,  $\exists \Delta(\varepsilon) = \text{pos meas set of } a$

- s.t. (a)  $F_{a,\varepsilon}$  has an ergodic SRB measure  
(b)  $\lambda_{\max} > 0$  Leb-a.e. in  $M$

We called the resulting attractors “rank-one attractors”  
= 1-D instability, strong codim 1 contraction

- “fattening up expanding circle maps e.g.  $z \mapsto z^2$  gives solenoid maps; slight “fattening up” of 1D maps (w/ singularities) gives rank-one maps
- passage to singular limit = lower dim’l object makes problem tractable
- rank-one attractors (generalization of Henon attractors) are currently the only class of nonuniformly hyperbolic attractors amenable to analysis
- proof in [BC] is computational, using formula of Henon maps; [WY]’s formulation + proof are geometric, independent of [BC]
- Motivation: rank-one attractors likely occur naturally, shortly after a system’s loss of stability
- [WY] gives checkable conditions so results can be applied without going thru 100+ page proof each time

# Application of rank-one attractor ideas

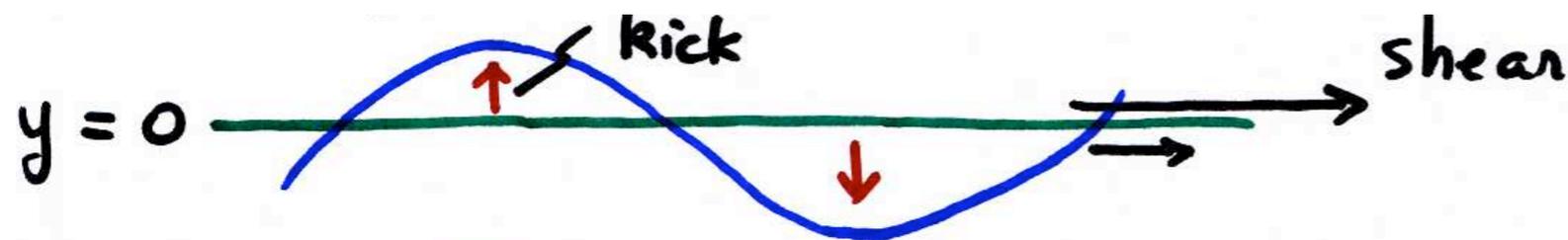
## Shear-induced chaos in periodically kicked oscillators

Simplest version: **linear shear flow**

$$\begin{aligned} \frac{d\theta}{dt} &= 1 + \sigma y && \text{kicks delivered with period } T \\ \frac{dy}{dt} &= -\lambda y + A \sin(2\pi\theta) \sum_{n=0}^{\infty} \delta(t - nT) \end{aligned}$$

$\theta \in \mathbb{S}^1$ ,  $y \in \mathbb{R}$ ,  $\sigma = \text{shear}$ ,  $\lambda = \text{damping}$ ,  $T \gg 1$

Unforced equation:  $\{y = 0\} = \text{attractive limit cycle}$

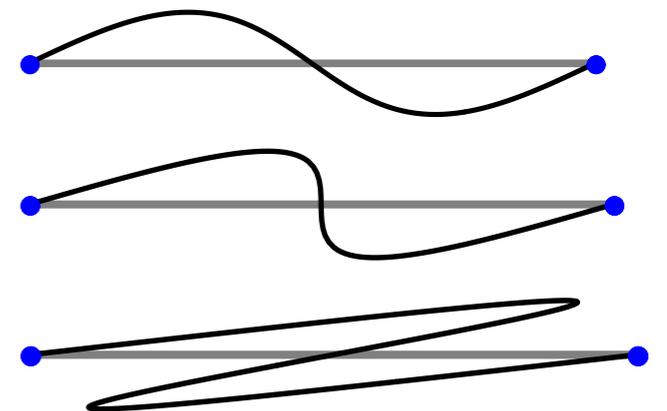


key :

$$\frac{\sigma}{\lambda} \cdot A = \frac{\text{shear}}{\text{damping}} \cdot \text{deformation}$$

assuming  $e^{-\lambda T} \ll 1$

Increasing shear



$$\dot{\theta} = 1 + \sigma y \quad T = \text{kick period} \quad \frac{\sigma}{\lambda} \cdot A = \frac{\text{shear}}{\text{damping}} \cdot \text{deformation}$$

$$\dot{y} = -\lambda y + \text{kick} \quad F_T = \text{time-T map of driven system}$$

### Theorem [Wang-Young 2000s]

(a) small  $\frac{\sigma}{\lambda} A$  : invariant closed curve

(b) as  $\frac{\sigma}{\lambda} A$  increases : invariant curve breaks, horseshoes develop  
(cf KAM)

(c) large  $\frac{\sigma}{\lambda} A$  : “dichotomy”

ergodic SRB meas

$\lambda_{\max} > 0$  pos meas set parameters

$\lambda_{\max} < 0$

horseshoes  
+ sinks

open set of parameters

Proof obtained by checking conditions in [WY]; general limit cycles OK.

### Other applications of this body of ideas

- homoclinic bifurcations [Mora-Viana 1990s]
- periodically forced Hopf bifurcations [Wang-Young 2000s]
- forced relaxation oscillators [Guckenheimer-Weschelberger-Young 2000s]
- Shilnikov homoclinic loops [Ott and Wang 2010s]
- forced Hopf bif in parabolic PDEs, appl to chemical networks [Lu-Wang-Young 2010s]

# Part IV. Extending the scope of existing theory

## A. Infinite dimensional systems

### Dynamical setting for certain classes of PDEs

Consider 
$$\frac{du}{dt} + Au = f(u)$$

where  $u \in X =$  function space,  $A =$  linear operator,  $f =$  nonlinear term

To define a  $C^r$  dynamical system, need  $(X, \|\cdot\|)$  s.t.

(1)  $u_0 \in X \implies u(t)$  exists and is unique in  $X$  for all  $t \geq 0$ ,

so **semiflow**  $f^t : X \rightarrow X$  is well defined

(2)  $t \mapsto u(t)$  is continuous for  $t \geq 0$

(3)  $f^t \in C^r$  for each  $t$

This imposes restriction on the choice of  $(X, \|\cdot\|)$

**Remark.** Dissipative PDEs (e.g. reaction diffusion eqtns) have attractors w/ a very finite dimensional character -- natural place to start

e.g. Multiplicative Ergodic Theorem proved only for Hilbert/Banach space operators that are quasi-compact [Mane, Ruelle, Thieullen, Lian-Lu ...]

# In infinite dimensions: what plays the role of Leb measure ?

More concretely, **what is a “typical” solution for a PDE ?**

Sample results

**Theorem** Under global invariant cones conditions:

(a) **Existence of center manifold**  $W^c$

Constantin-Fois-Nicolaenko 80s,  
Chow, Sell, Mallet-Paret, Lu ...

(b) **Existence of stable**  $W^s$  **foliation** [known]

(c) **Absolute continuity of**  $W^s$ -**foliation in the case**  $\dim(W^c) < \infty$

i.e. if  $\Sigma_1, \Sigma_2 =$  **disks transversal to**  $W^s$ , [Lian-Young-Zeng 2010s]

and  $\theta : \Sigma_1 \rightarrow \Sigma_2$  **is holonomy along**  $W^s$ -**leaves,**

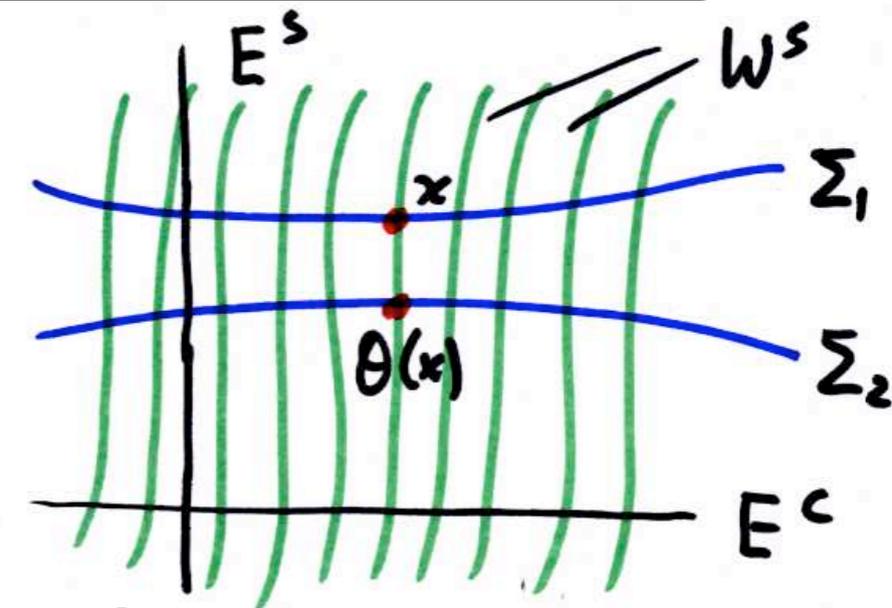
**then**  $\text{Leb}(\theta(A)) \leq c \text{Leb}(A)$  for all Borel  $A \subset \Sigma_1$ .

## Interpretation

Notion of “*almost everywhere*” in Banach space

inherited from Leb measure class on  $W^c$

e.g. a.e. in the sense of k-parameters of initial conditions



General idea: use of *finite dim'l probes in infinite dim sp*

More general setting  $X =$  Banach or Hilbert space

$$F : [0, \infty) \times X \rightarrow X \text{ cts semiflow, } f^t(x) = F(t, x)$$

Assume (1)  $F|_{(0, \infty) \times X}$  is  $C^2$

(2)  $f^t, Df_x^t$  injective [backward uniqueness]

(3) existence of compact  $A \subset X, f^t(A) = A$  [attractor]

**Theorem** Assume no 0 Lyap exponents.

(a) [Li-Shu, Blumenthal-Young 2010s]  $\mu$  is an SRB measure if and only if

$$h_\mu(f) = \int \sum_i \lambda_i^+ \dim E_i d\mu$$

(b) [Blumenthal-Young 2010s] Absolute continuity of  $W^s$

i.e. statistics of SRB visible

## B. Random dynamical systems (RDS)

$$\cdots f_{\omega_3} \circ f_{\omega_2} \circ f_{\omega_1}, \quad i.i.d. \quad \text{with law } \nu$$

where  $\nu$  is a Borel probability on  $C^r(M) =$  space of self-maps of

Motivation : small random perturbations of deterministic maps, SDEs

# Two notions of invariant measures

Stationary measure  $\mu(A) = \int P(A|x) d\mu(x)$

Equivalently,  $\mu = \int (f_\omega)_* \mu \mathbb{P}(d\omega)$  in the random maps representation

Sample measures =  $\mu$  conditioned on the past

$$\underline{\omega} = (\omega_n)_{n=-\infty}^{\infty} \quad \mu_{\underline{\omega}} = \lim_{n \rightarrow \infty} (f_{\omega_{-1}} \circ \cdots \circ f_{\omega_{-n+1}} \circ f_{\omega_{-n}})_* \mu$$

**Interpretation :**  $\mu_{\underline{\omega}}$  describes what we see at time 0 given that the transformations  $f_{\omega_n}, n \leq 0$ , have occurred.

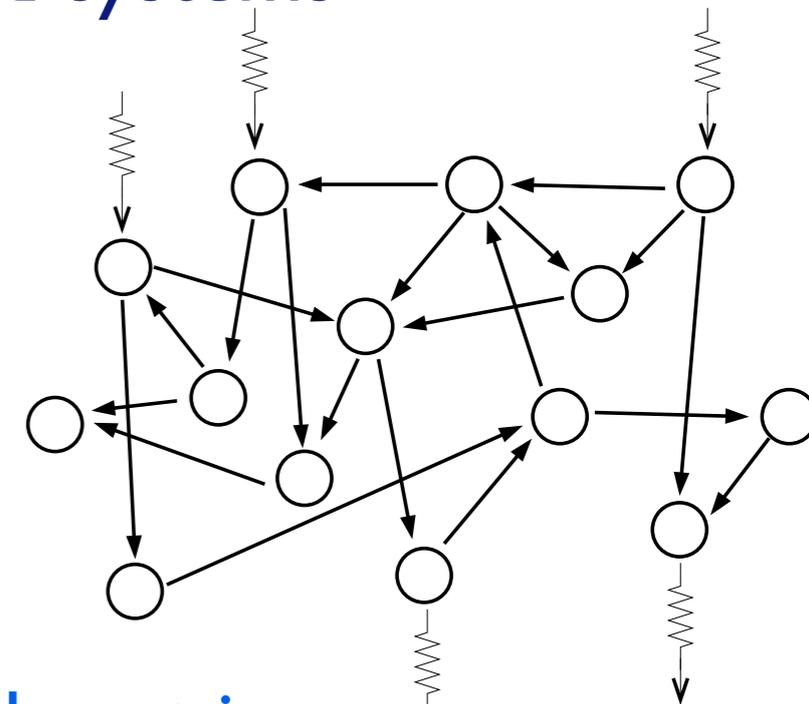
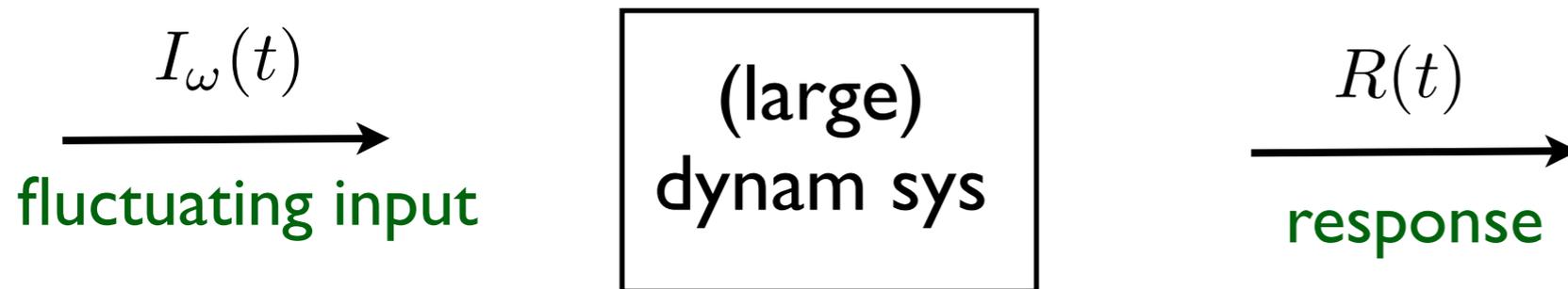
**Theorem.** Given RDS with stationary  $\mu$ ,  $\lambda_{\max}$  = largest Lyap exp

(a) [Le Jan, 1980s] If  $\lambda_{\max} < 0$ , then  $\mu_{\underline{\omega}}$  is supported on a finite set of points for  $\nu^{\mathbb{Z}}$  - a.e.  $\underline{\omega}$  called **random sinks**.

(b) [Ledrappier-Young, 1980s] If  $\mu$  has a density and  $\lambda_{\max} > 0$ , then entropy formula holds and  $\mu_{\underline{\omega}}$  are **random SRB measures** for  $\nu^{\mathbb{Z}}$  - a.e.  $\underline{\omega}$

(c) [L-Y 1980s] Additional Hormander condition on derivative process partial dimensions satisfy  $\delta_i = 1$  for  $i < i_0$ ,  $\delta_i = 0$  for  $i > i_0$

# Application: *reliability* of biological and engineered systems



$x_0$  = is internal state of system at time of presentation

Say the dyn sys is *reliable* wrt a class of signals

if the dependence of  $R(t)$  on  $x_0$  tends to 0 with as  $t$  increases.

If  $\lambda_{\max} < 0$  and a.e.  $\mu_{\underline{\omega}}$  is, e.g. supported on a single point, then

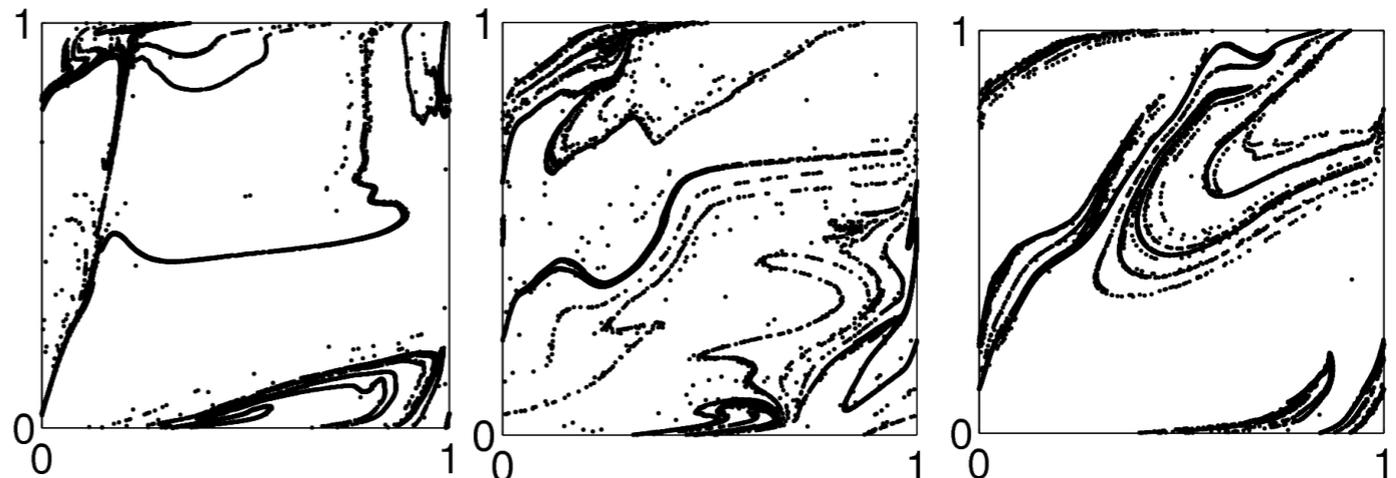
$x_t$  = state of system at time  $t$  is largely indep of  $x_0$  : *reliable*

If  $\lambda_{\max} > 0$  then  $\mu_{\underline{\omega}}$  is supported on stacks of lower dim'l surfaces,

$x_t$  depends on  $x_0$  no matter how long we wait: *unreliable*

Example: coupled oscillators

at  $t = 50, 500, 2000$



Another application of RDS : **climate** e.g. Ghil group  
stationary meas: theoretical avg vs sample meas: now given history

## C. Open dynamical systems

= systems in contact with external world (rel to nonequilibrium stat mech)

A simple situation is **leaky systems, i.e., systems with holes**

Questions include escape rate  $\rho$  , surviving distributions etc

Sample result :

**THEOREM** [Demers-Wright-Young 2000s] **Billiard tables with holes**

(1) escape rate  $\rho$  is well defined

(2) limiting surviving distribution  $\mu_\infty$  well defined & conditionally invariant

$$f_*(\mu_\infty)|_{M \setminus H} = e^{-\rho} \mu_\infty$$

(3) characterized by SRB geometry and entropy formula  $h - \sum \lambda_i^+ m_i = \rho$

(4) tends to SRB measure as hole size goes to 0

Result extendable to systems admitting Markov extension

## D. Farther afield

In biological systems, I've encountered the following challenges :

- (1) *Inverse problems* : Given basic structure + *outputs* of system, deduce dynamics and (nonequilibrium) steady states
- (2) Continuous adaptation to (changing) stimulus, & partial convergence to *time-dependent steady states*

## Concluding remarks

- Importance of idea measured by impact and how it shapes future development , *SRB ideas truly lasting*
- *Dynamical systems* has evolved since the 1970s, *will remain fun , vibrant , and relevant* as long as it continues to evolve .....