

# Algorithms for Processing the Labeled Conley Index

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CU Boulder Computer Science

Joint with Sarah Day

May 21, 2017

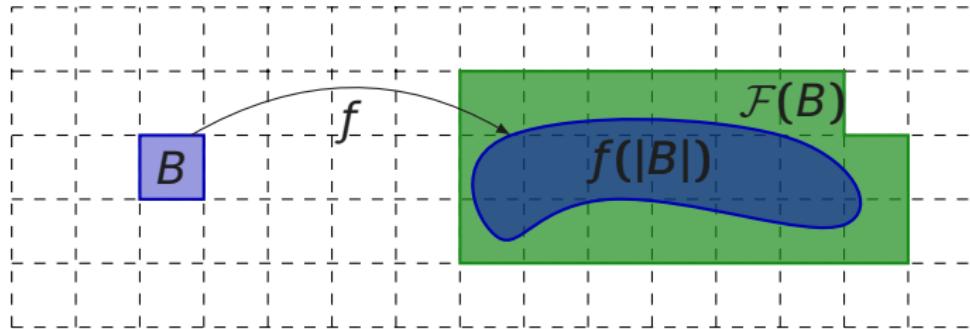
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Goal: *automated rigorous computations  
to capture complex dynamics*

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1. Discretize and compute combinatorial enclosure



2. Build Conley index pair
3. Compute index representative [CHomP]
4. Process the index information ← *this talk*

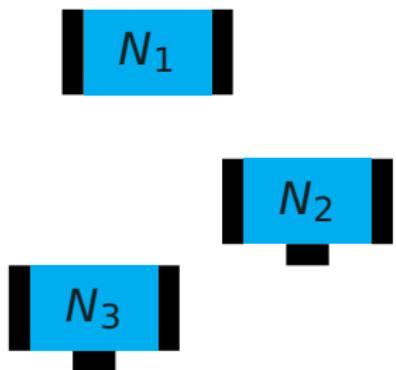
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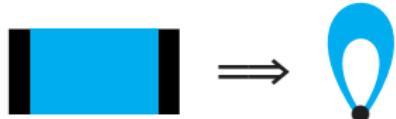
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**Ważewski Principle:**  
 $\text{Con}(S, f) \neq [0]_s \implies S \neq \emptyset$



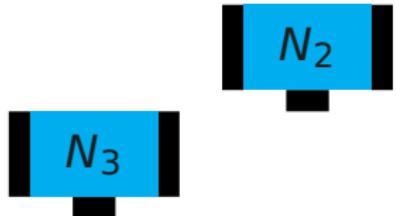
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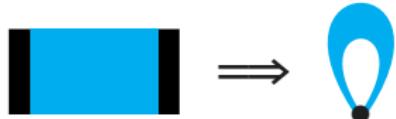
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**Corollary:**  
 $\text{Con}(S', f|_{N_3} \circ f|_{N_2} \circ f|_{N_1}) \neq [0]_s$



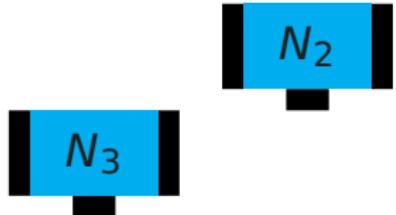
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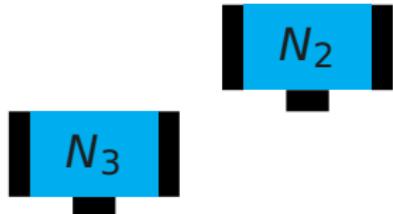
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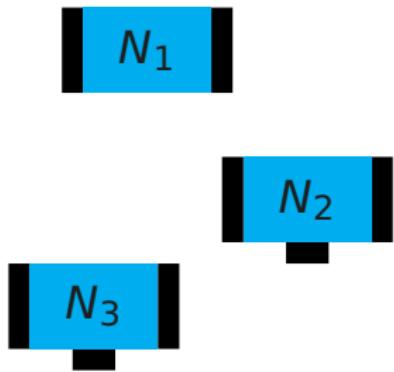


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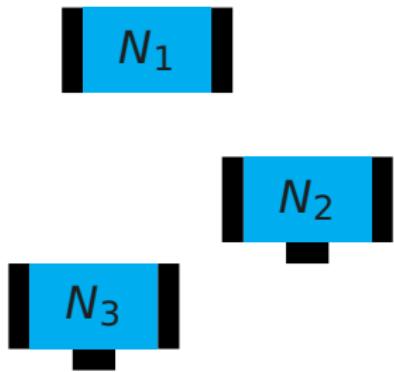
**Labeled Conley index:** set of all such cyclic Conley indices

# Labeled Conley Index

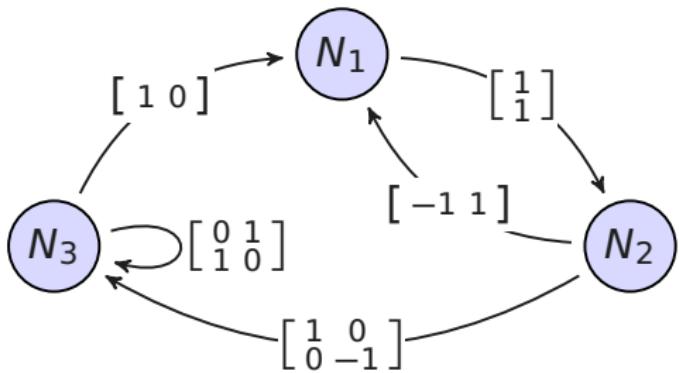


	$N_1$	$N_2$	$N_2$	$N_3$	$N_3$
$N_1$	0	-1	0	1	-1
$N_2$	1	0	0	0	0
$N_2$	1	0	0	0	0
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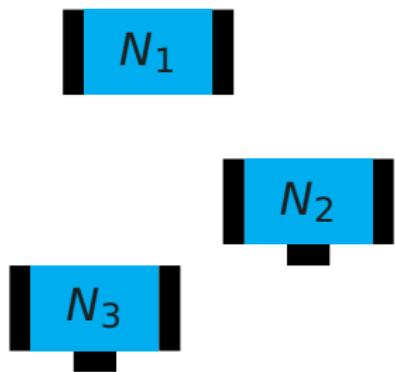
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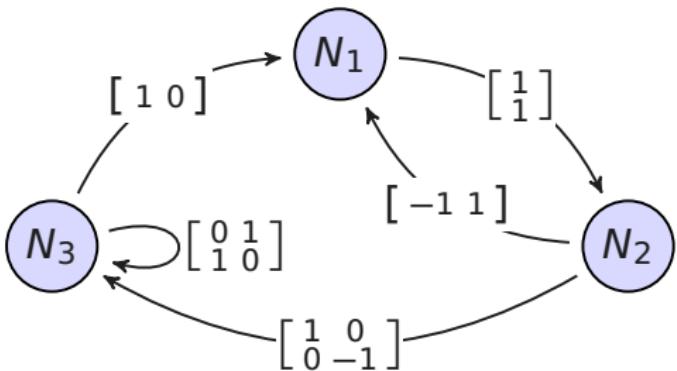


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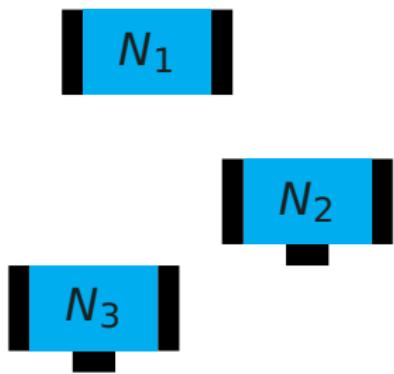


$\text{Con}(S', f|_{N_3} \circ f|_{N_2} \circ f|_{N_1})$

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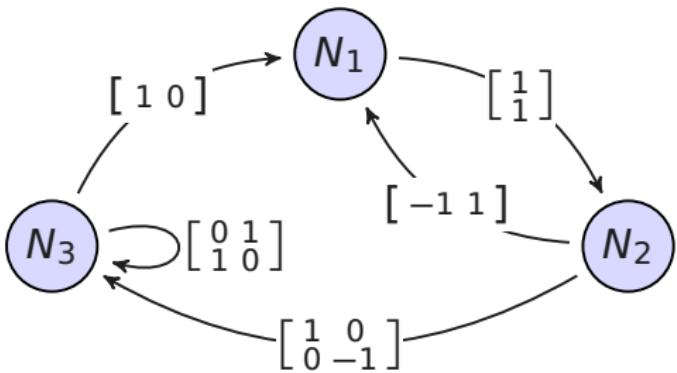


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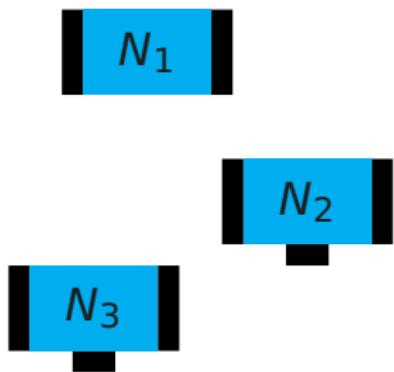


$$\text{Con}(S', f|_{N_3} \circ f|_{N_2} \circ f|_{N_1}) \\ = (M^{31} M^{23} M^{12})_S$$

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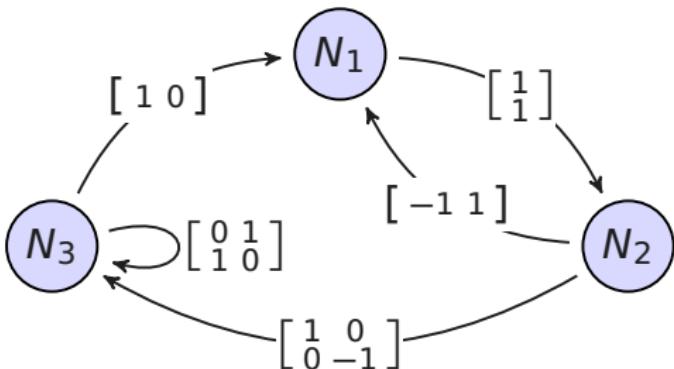


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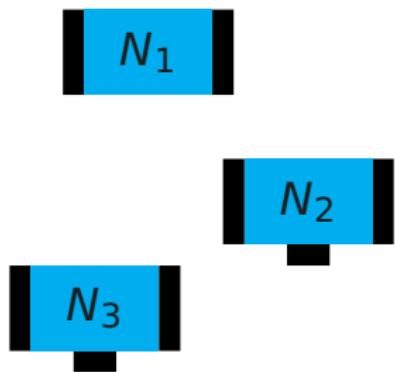


	N <sub>1</sub>	N <sub>2</sub>	N <sub>2</sub>	N <sub>3</sub>	N <sub>3</sub>
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$$\begin{aligned}
 & \text{Con}(S', f|_{N_3} \circ f|_{N_2} \circ f|_{N_1}) \\
 &= (M^{31} M^{23} M^{12})_s \\
 &= ([1 \ 0] [1 \ 0] [0 \ -1] [1 \ 1])_s \\
 &= [1]_s \neq [0]_s \\
 \implies & \exists x \rho(x) = \overline{123}
 \end{aligned}$$

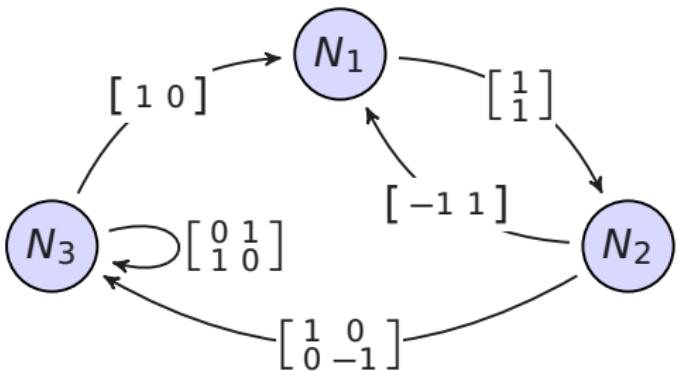


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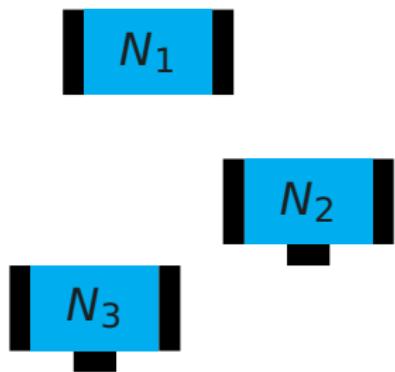


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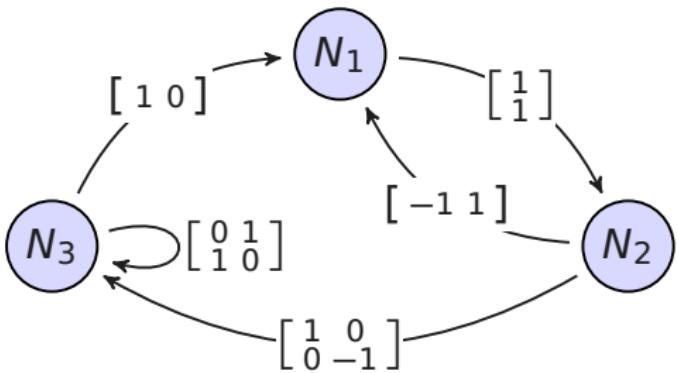


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$$\begin{aligned} \text{Con}(S', f|_{N_2} \circ f|_{N_1}) \\ = & (M^{21} M^{12})_s \\ = & ([ -1 \ 1 ] [ \begin{smallmatrix} 1 \\ 1 \end{smallmatrix} ])_s = [ 0 ]_s \\ \Rightarrow & \exists x \rho(x) = \overline{12} \end{aligned}$$

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Goal: prove semi-conjugacies to symbolic dynamics

*Why: entropy, periodic orbits, etc.*

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- Finite alphabet  $\mathcal{A}$  (*here regions of phase space*)
- Bi-infinite seq  $x = \dots x_{-2} x_{-1} x_0 x_1 x_2 \dots$  with  $x_i \in \mathcal{A}$
- Full shift  $X_{\text{full}} = \mathcal{A}^{\mathbb{Z}}$
- Shift map  $\sigma : \mathcal{A}^{\mathbb{Z}} \rightarrow \mathcal{A}^{\mathbb{Z}}$ ,  $\sigma(x)_i = x_{i+1}$
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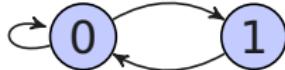
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SFT (vertex shift)



$$\mathcal{F} = \{11\}$$

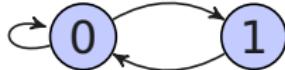
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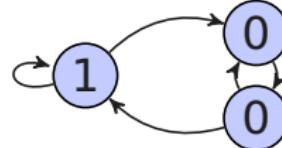
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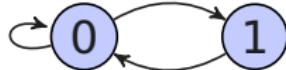
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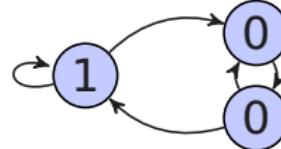
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In both cases, topological entropy  $h(X_G) = \log \lambda_{\max}(G)$

# Constructing Semi-Conjugacies

Idea: find lots of cycles yielding nontrivial Conley index

**Proposition:** If  $X$  is a shift space of cycles with nontrivial index, then  $f$  is semi-conjugate to  $\bar{X} := \text{cl}(X)$ .

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$$X^P := \text{cl}\left( \overline{\cup\{\overline{x_1 \cdots x_k} : \text{Con}(S', f|_{N_{x_k}} \circ \cdots \circ f|_{N_{x_1}}) \neq [0]_s\}} \right)$$

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*Aside: cocyclic subshifts [Kwapisz 2000]*

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**Proposition:**  $f$  is semi-conjugate to (any subshift of)  $X^P$

But *computing*  $X^P$  seems daunting...

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[with Sarah Day and Rodrigo Treviño]

- Start with complete graph
- Remove edges, until you can prove...
- All cycles in the graph have nontrivial index

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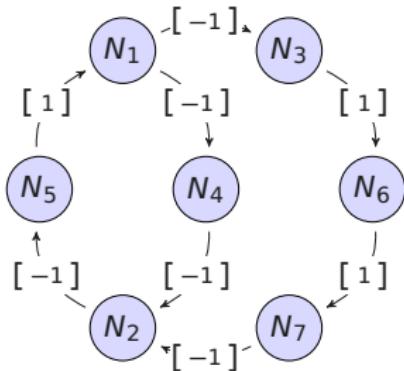
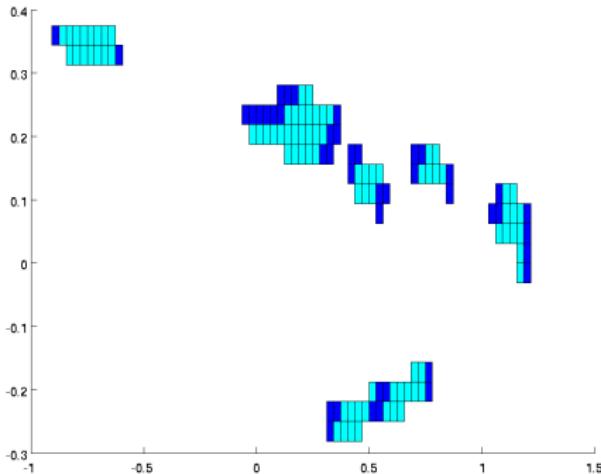
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Could be infinitely many cycles!

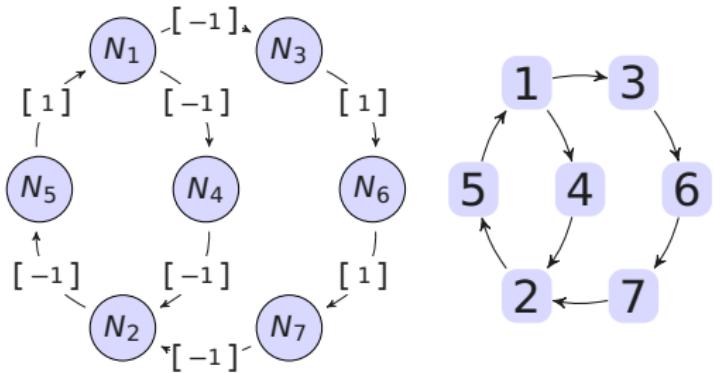
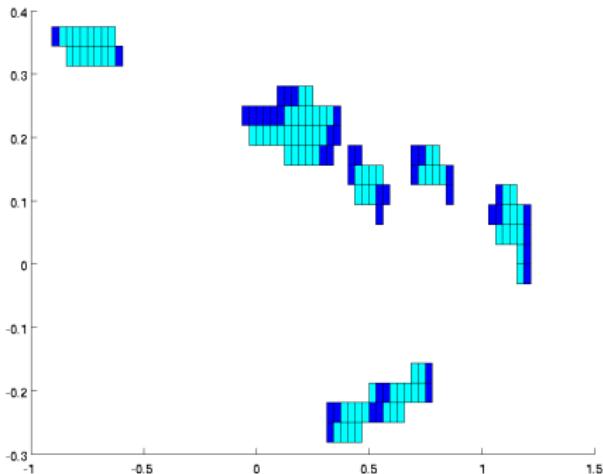
Technique: look for scalar multiples of matrix products seen before, and proceed by induction

- Tricky argument
- Fairly slow, but gets the job done

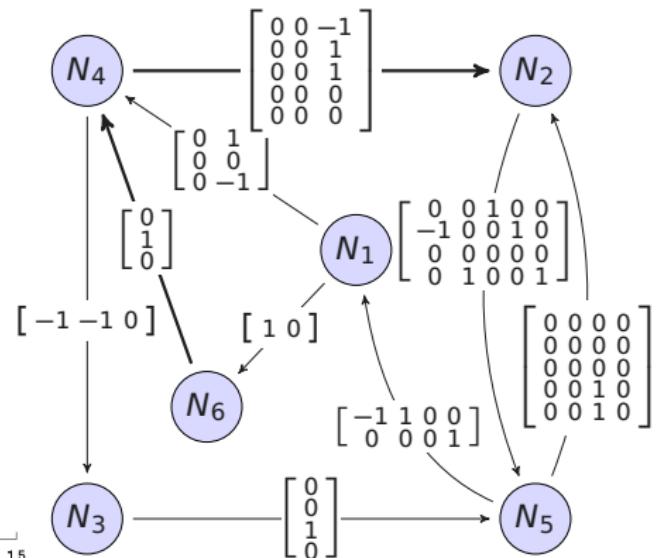
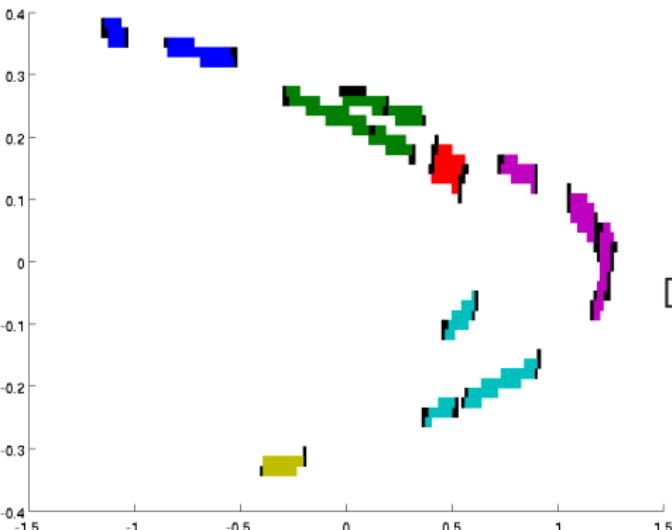
# Small Hénon Example



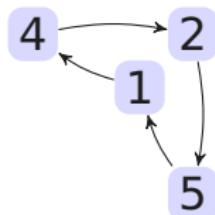
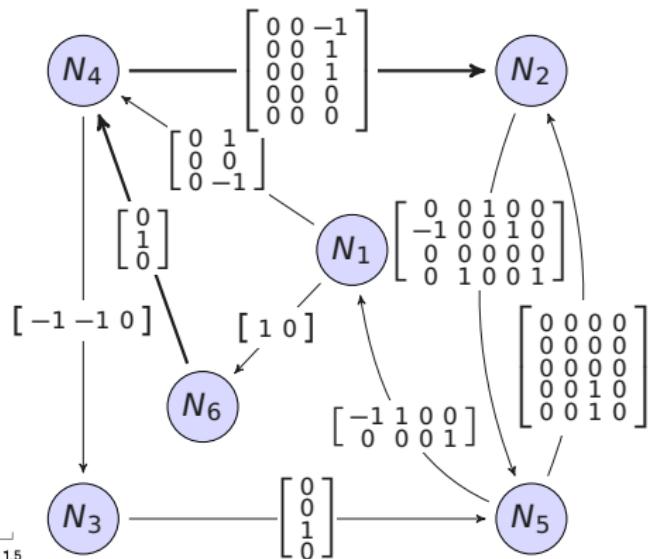
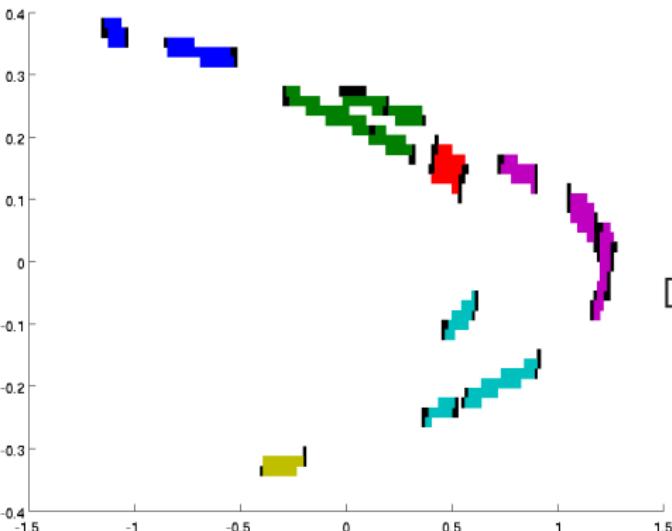
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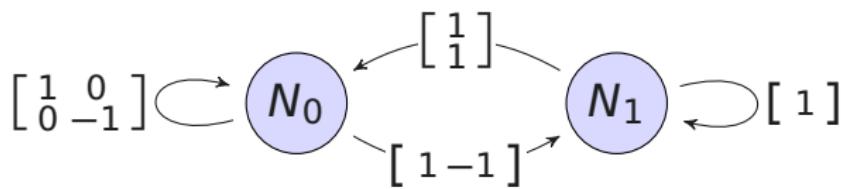
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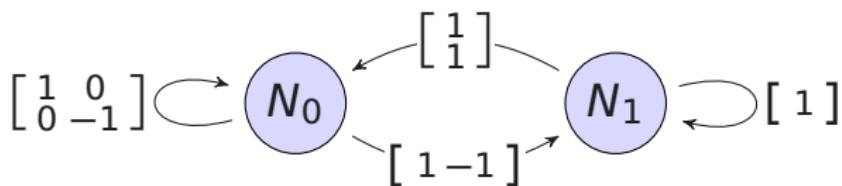
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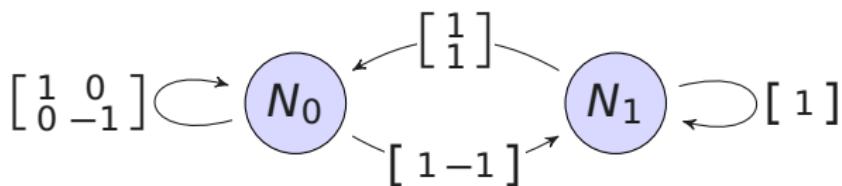


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SFT approach: have to cut edge  $(0, 1)$  or  $(1, 0)$  because  
 $M^{01}M^{10} = [1 -1][1] = 0$

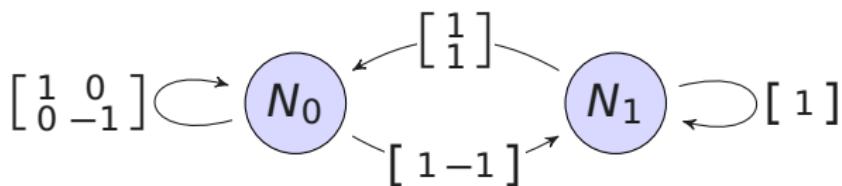
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**Let's dream big.** What is  $X^P$ ?

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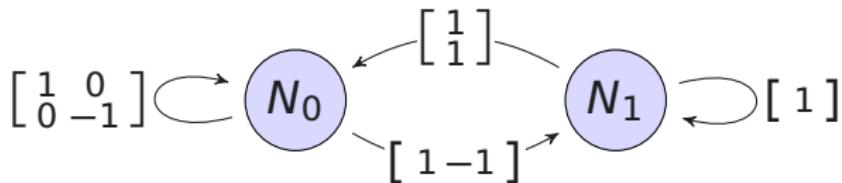


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*sofic shift, but not SFT*

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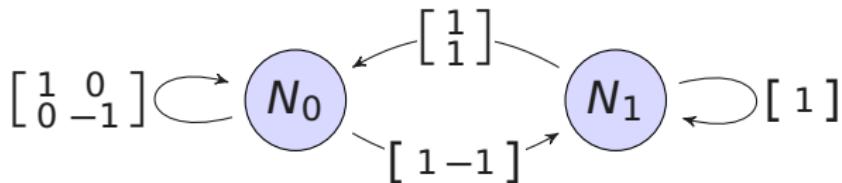
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**Key idea:** Build sofic shift iteratively, whose states encode enough info to decide if next transition yields a 0 matrix product: **matrix image space**

# Algorithm: Sofic Processor

**Require:** Labeled Conley index  $M \in \mathbb{Z}^{n \times n}$ , # iter  $\tau$

**Ensure:** Vertex presentation  $G$  of a sofic subshift of  $X^P$

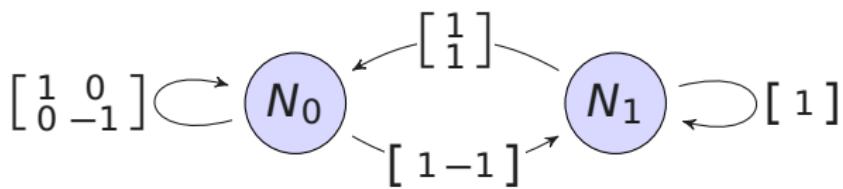
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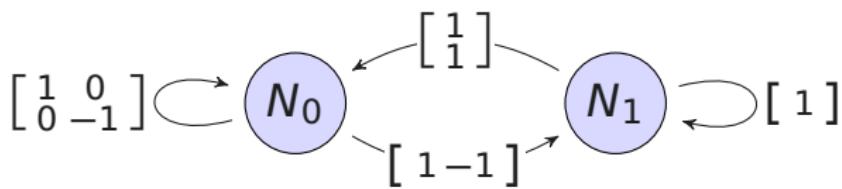
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```
1: procedure SoficProcessor( $M, \tau$ )
2:    $G \leftarrow$  empty graph with nodes  $\{a, I_a\}$  for all  $a \in \mathcal{A}$ 
3:   mark all nodes of  $G$ 
4:   while marked nodes left, or until  $\tau$  iterations, do
5:     unmark some marked node  $\{a, A\}$  of  $G$ 
6:     for  $b \in \mathcal{A}$  do
7:        $B \leftarrow \text{ech}(M^{ab} A)$ 
8:       if  $B = 0$ , continue
9:       if  $\{b, B\} \notin G$  then
10:         add node  $\{b, B\}$  to  $G$  and mark it
11:         add edge  $(\{a, A\}, \{b, B\})$  to  $G$ 
12:   return sink strongly-connected component of  $G$ 
```

# Example Run



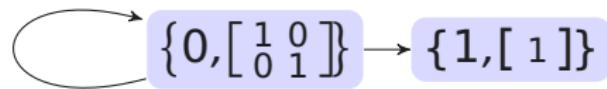
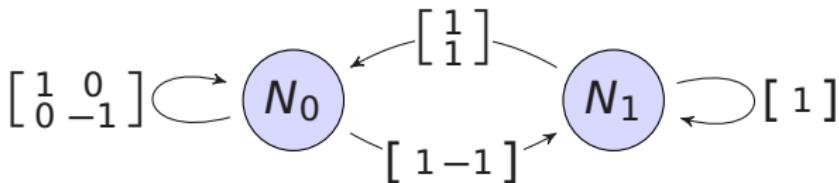
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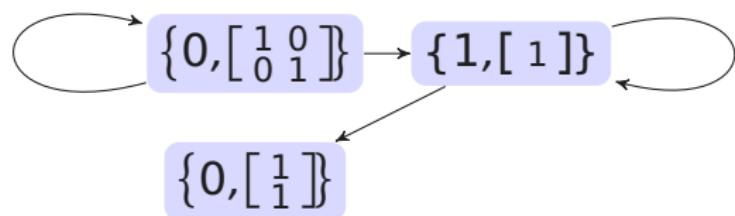
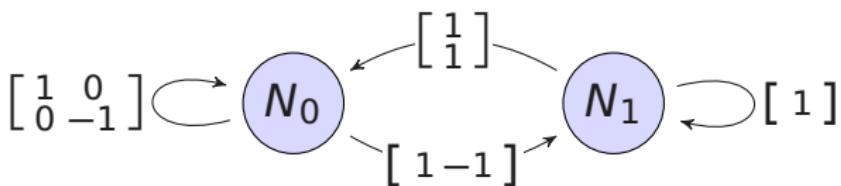
{0,[ $\begin{smallmatrix} 1 & 0 \\ 0 & 1 \end{smallmatrix}$ ]}

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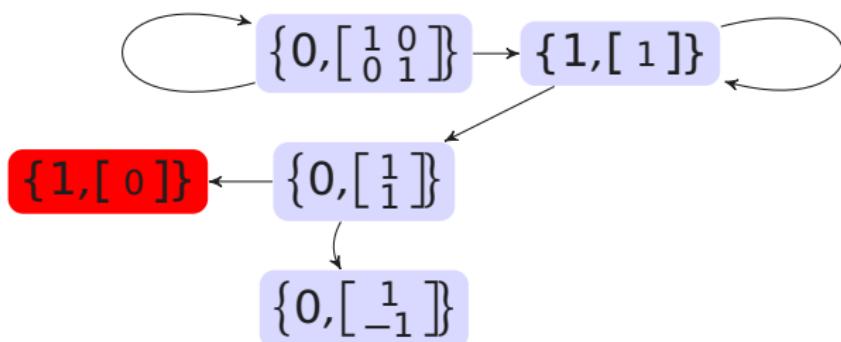
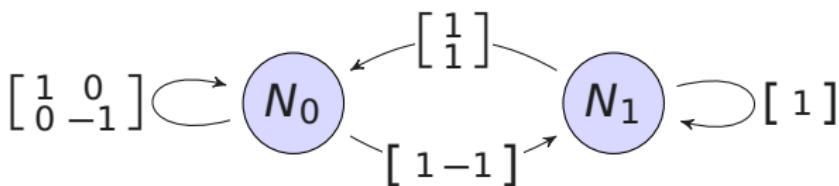
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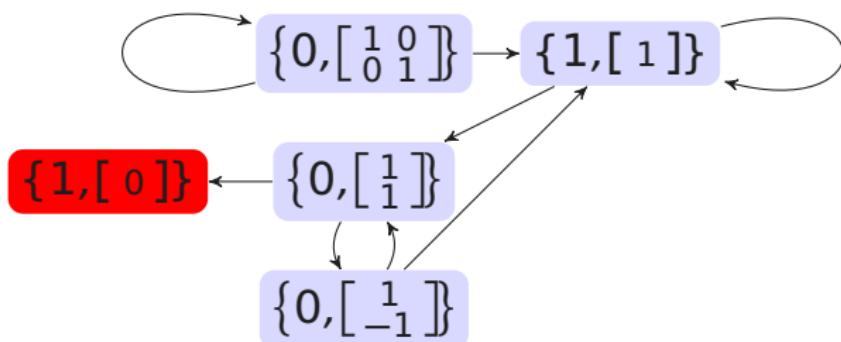
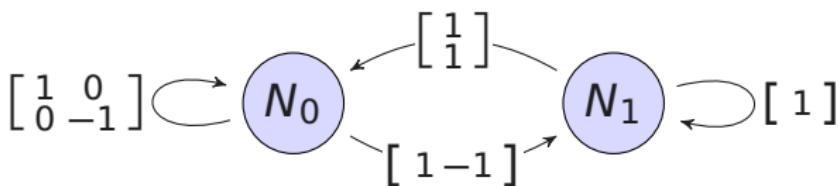
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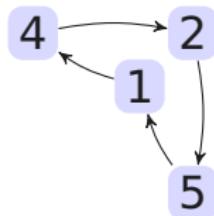
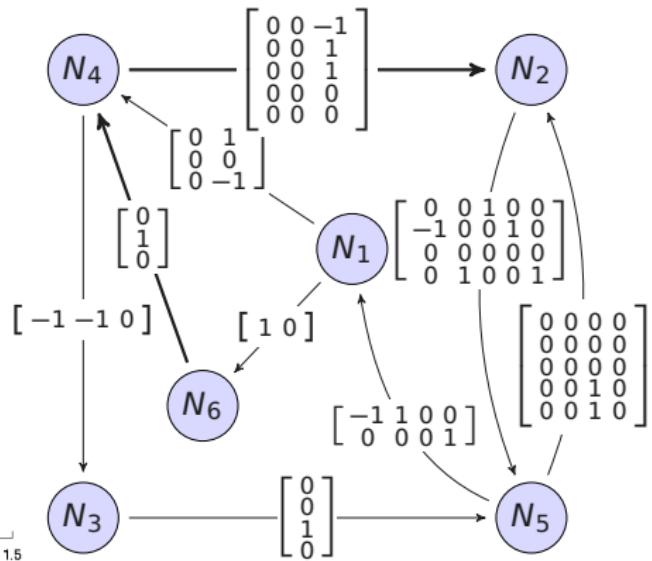
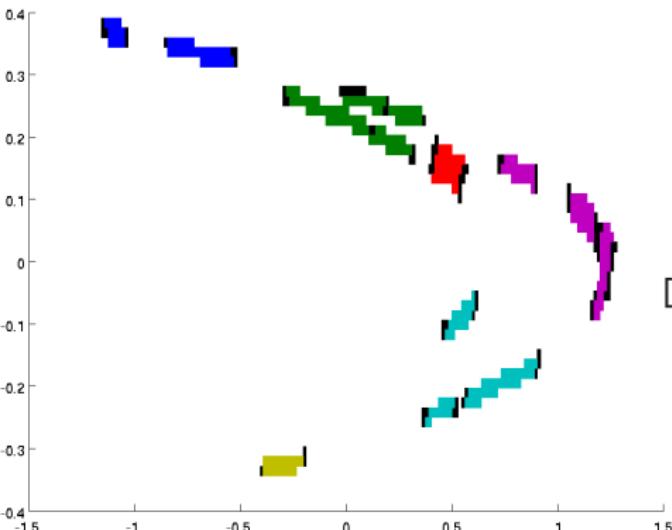
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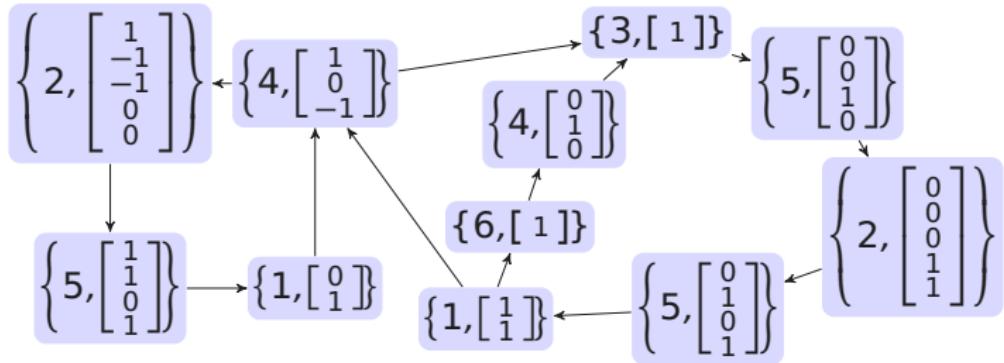
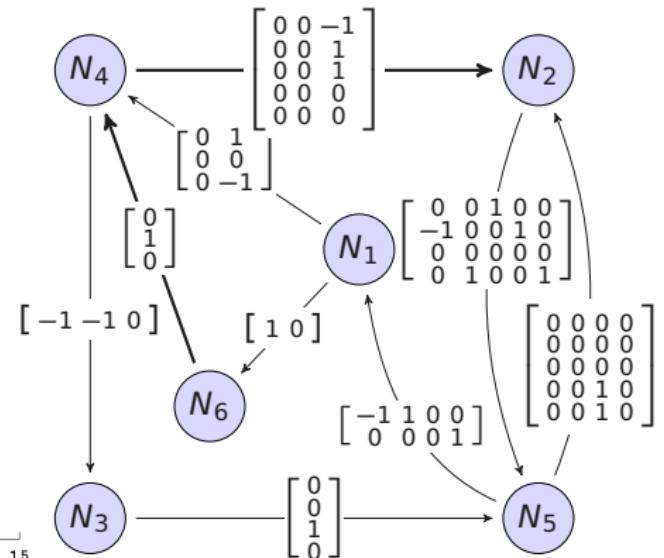
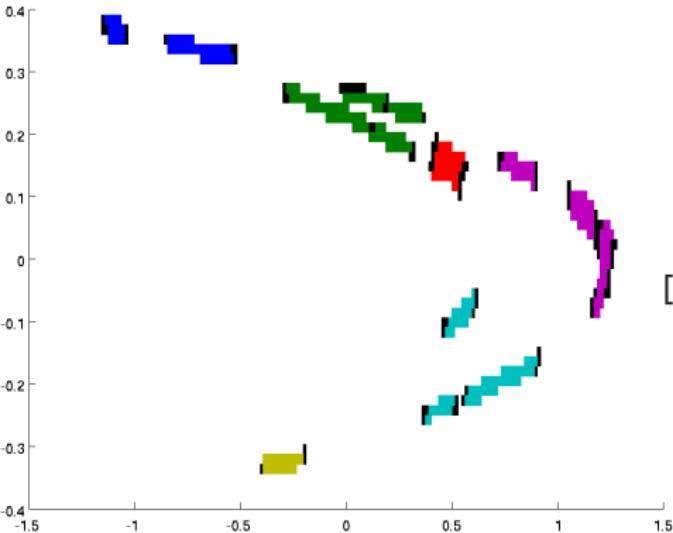


# Example Run



# Medium Hénon Example





# Optimality

But is this expressive enough to get all of  $X^P$ ?

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*If Algorithm 1 (sofic processor) terminates before the cutoff  $\tau$ , and returns  $G$ , then  $\overline{X_G} = X^P$ , and  $X^P$  is sofic.*

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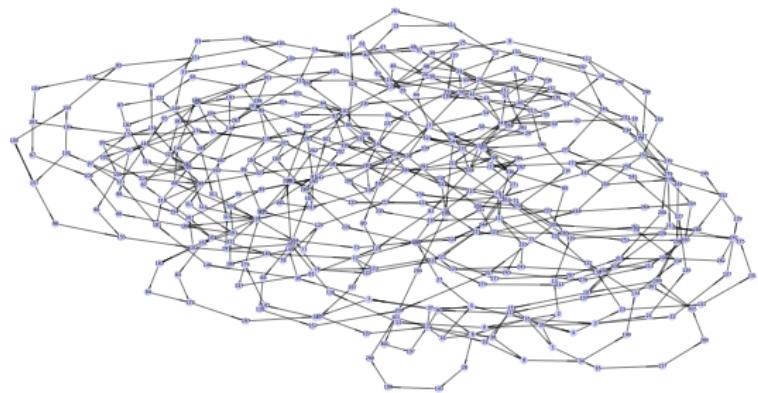
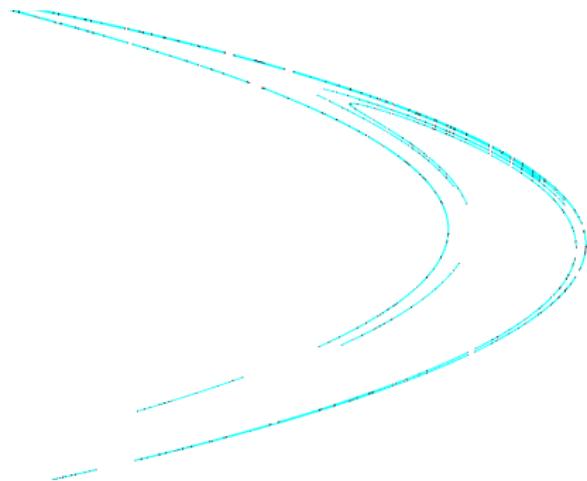
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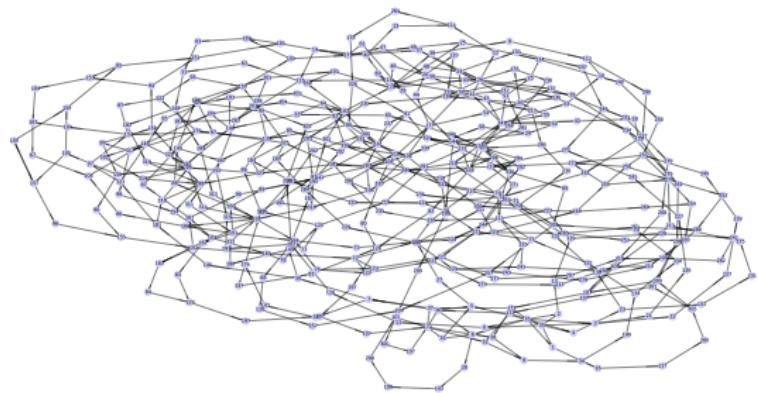
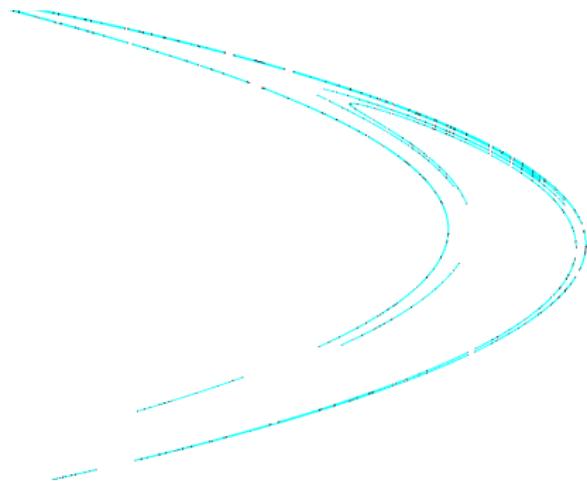
Always happens in practice!  
*100s of examples and counting...*

# Massive Hénon Example



Index pair: built from 350 low-period orbits  
185030 boxes (+ 3193 exit set), 342 regions  $\leftarrow \mathcal{A}$

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$X^P$  is sofic!  $G$  has 388 vertices and 586 edges.  
 $h(\text{Hénon}) \geq h(X^P) \geq 0.4555$  up from 0.4320

# Summary

Automated rigorous tools to capture complex dynamics

Optimal conversion: Conley index → symbolic dynamics

Code available soon...

email [raf@colorado.edu](mailto:raf@colorado.edu) if interested

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