

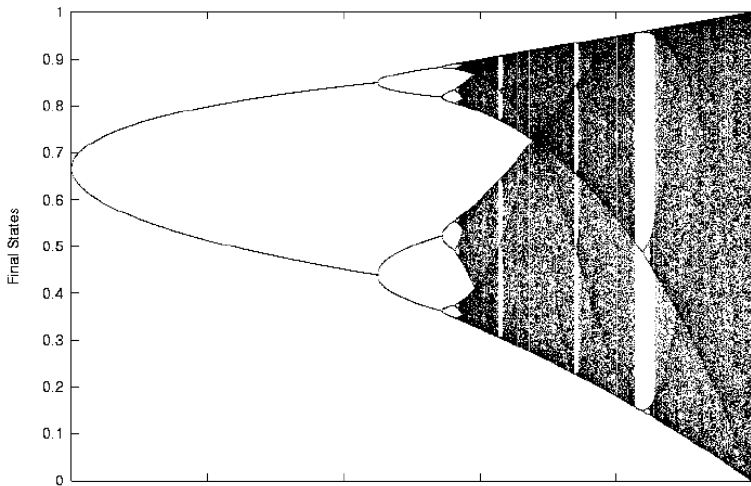
# Motivating examples in dynamical systems

Vaughn Climenhaga

University of Houston

October 16, 2012

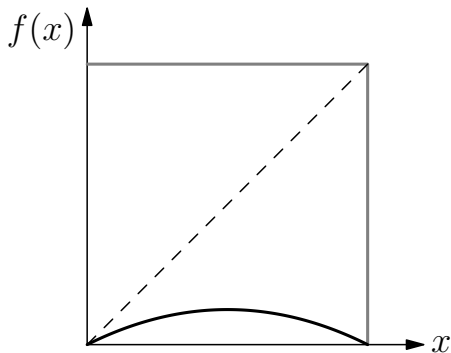
# A pretty picture



# The logistic map

**Logistic map:**  $f(x) = \lambda x(1 - x)$

$$0 \leq \lambda \leq 4$$



$$\lambda = 0.5$$

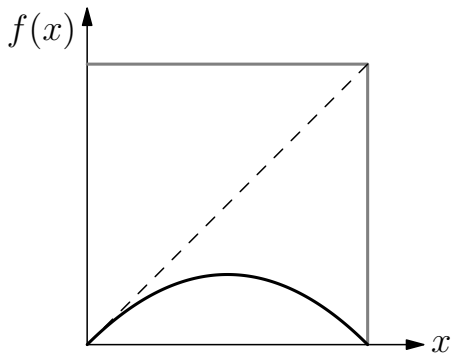
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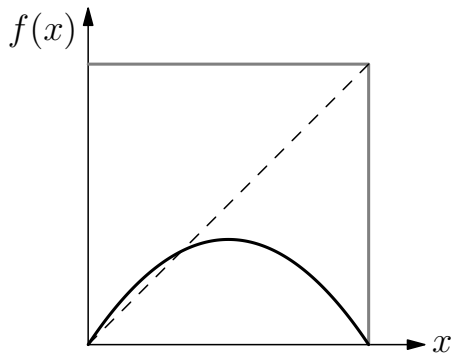
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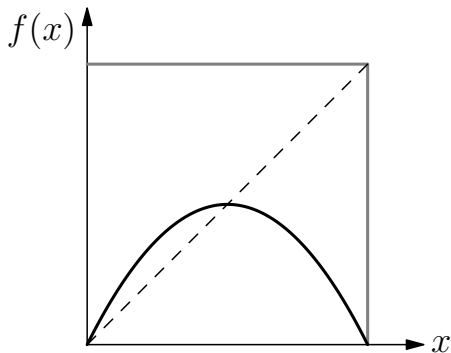
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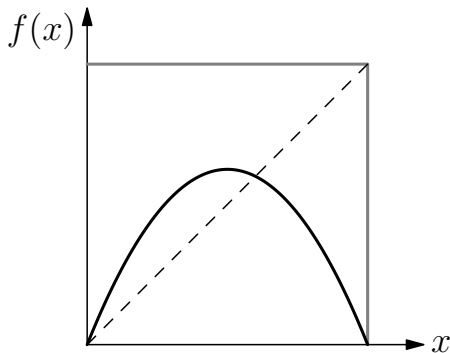
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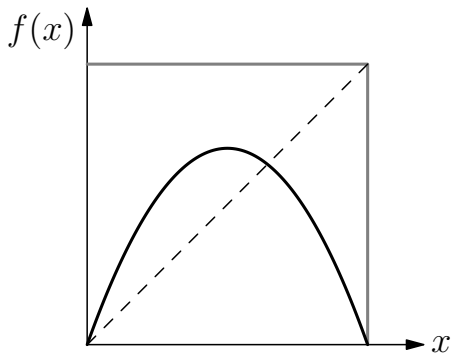
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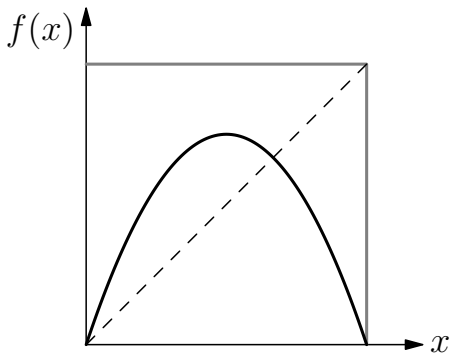
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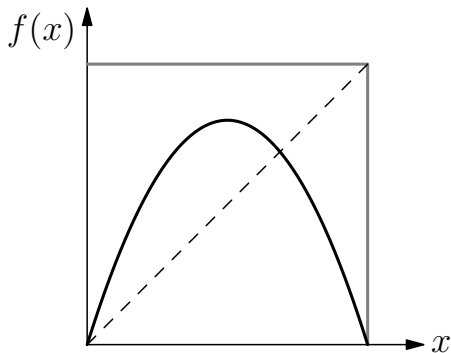
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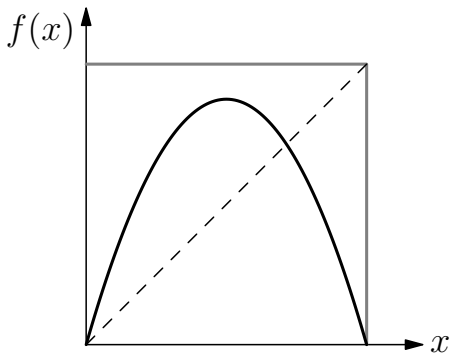
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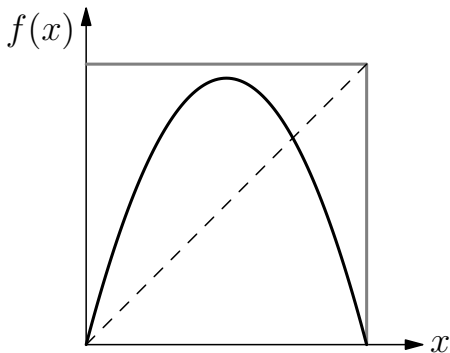
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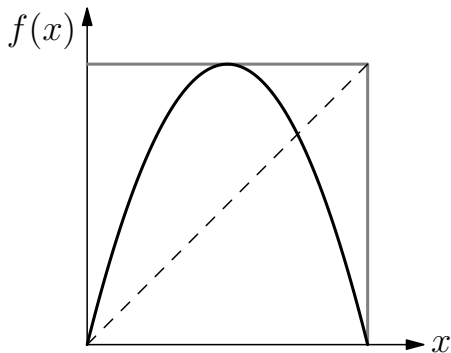
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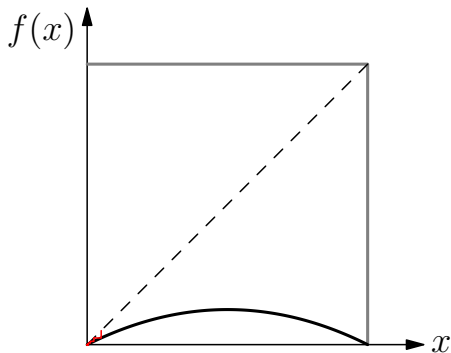
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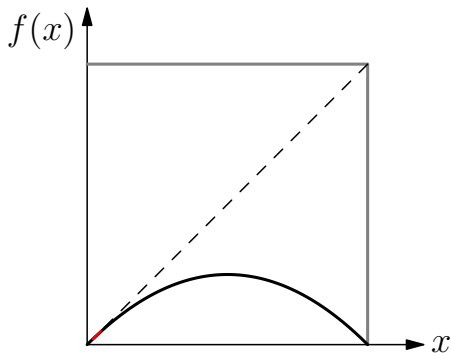
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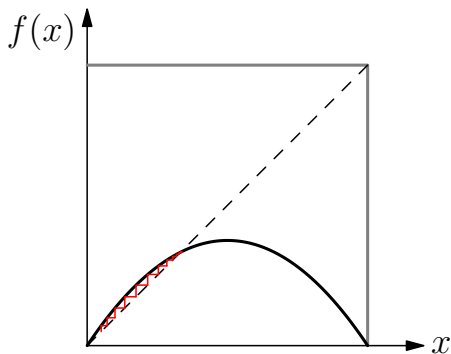
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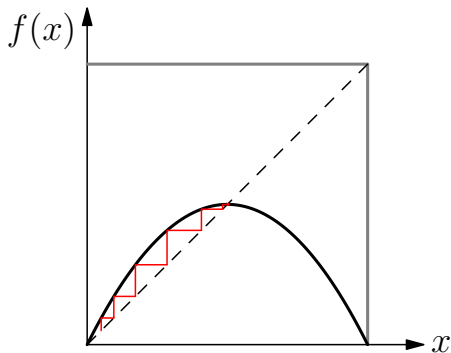
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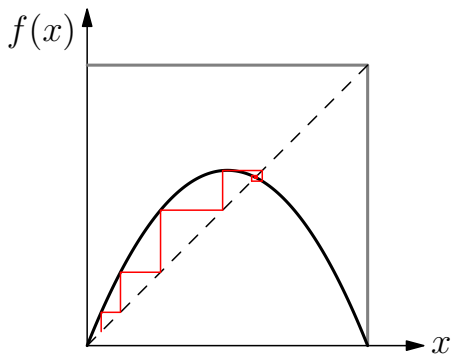
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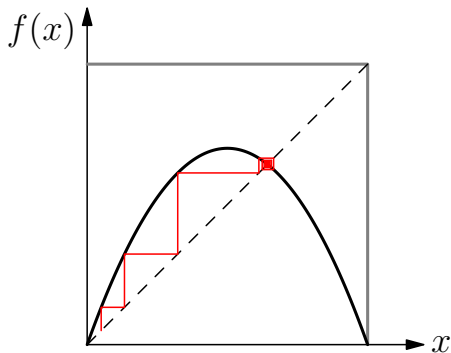
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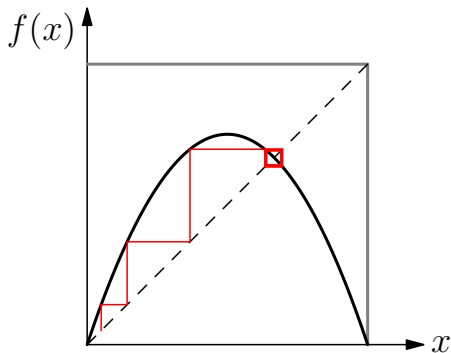
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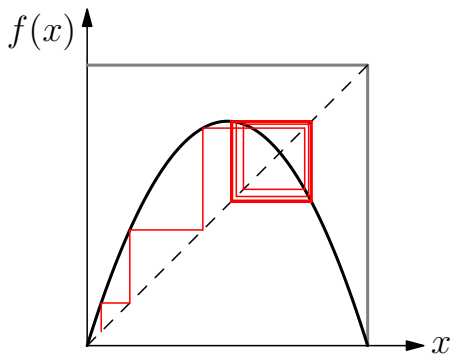
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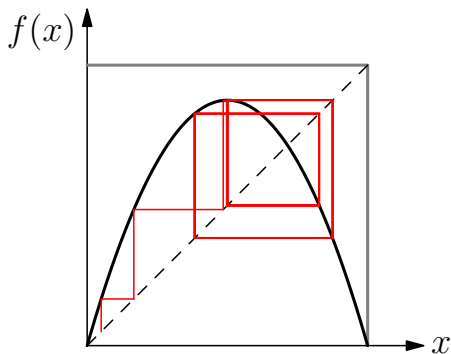
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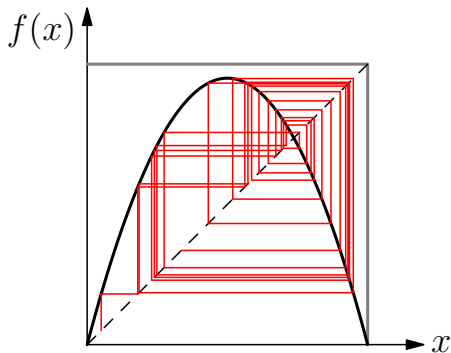
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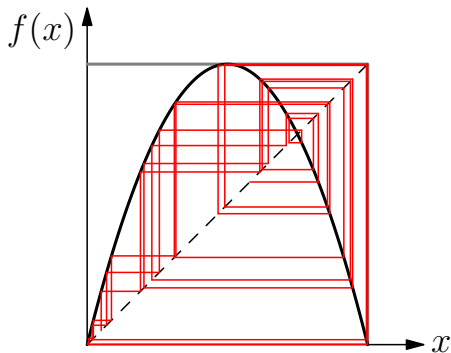
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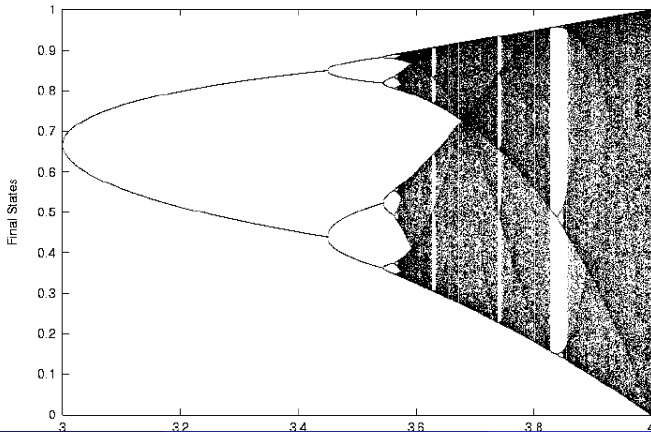
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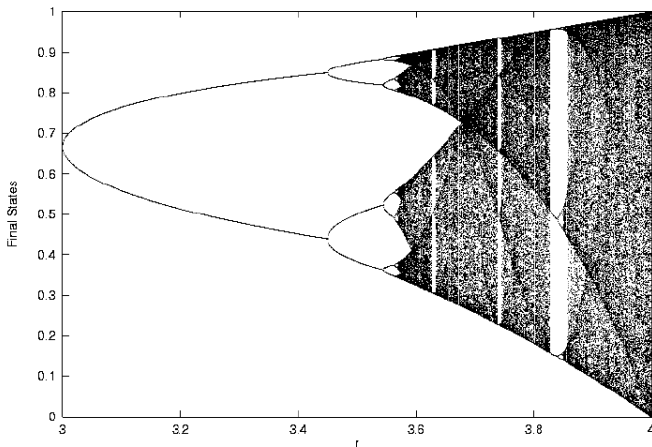
# More than just a pretty picture

**Bifurcation diagram.** Horizontal = parameter, vertical = recurrent states



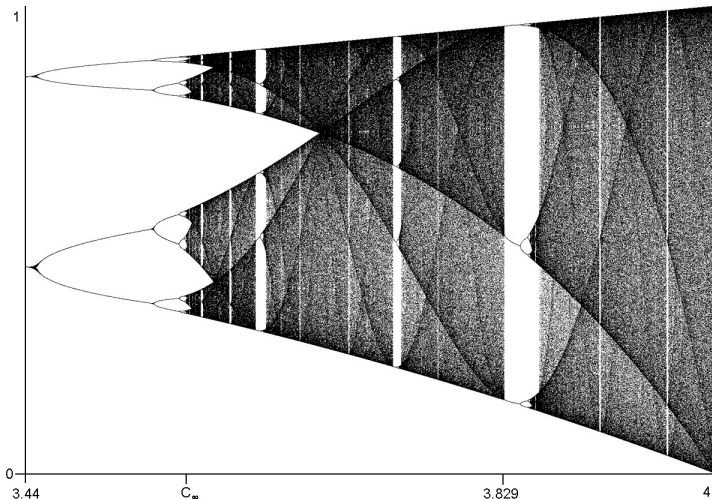
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$\lambda \in [3, 3.57\dots]$  ← period-doubling cascade



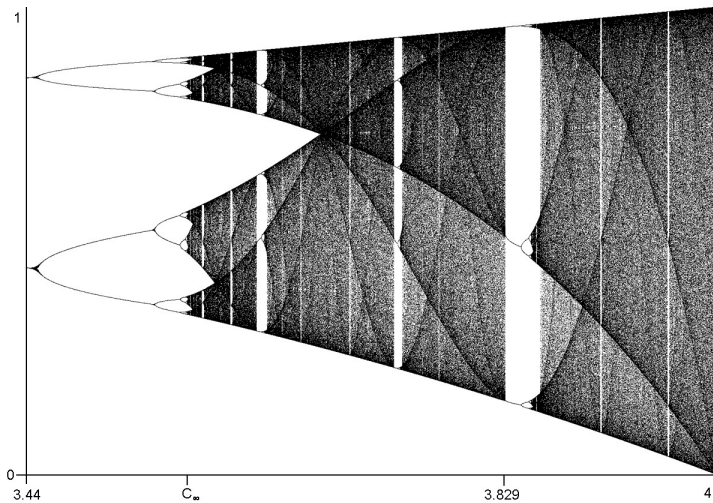
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$\lambda \in [3.832, 3.857 \dots]$  ← window of stability



# More than just a pretty picture

$\lambda = 4 \leftarrow$  chaos

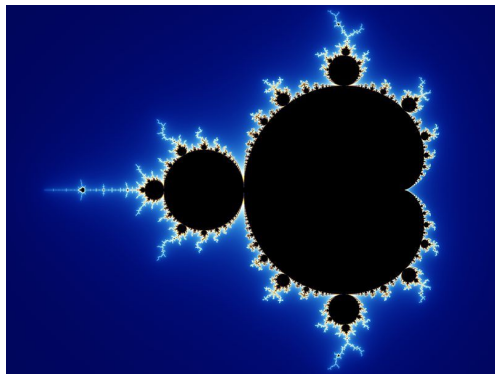


# Aside: Mandelbrot set



Fix  $c \in \mathbb{C}$ : let  $z_0 = 0$ ,  $z_{n+1} = z_n^2 + c$ .

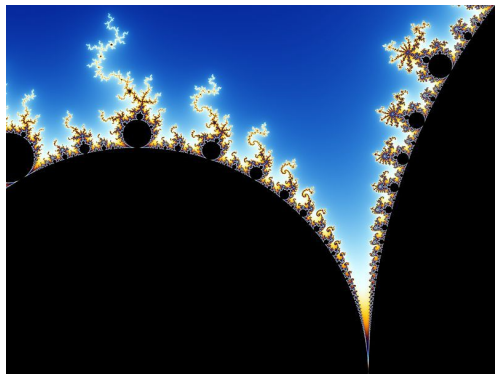
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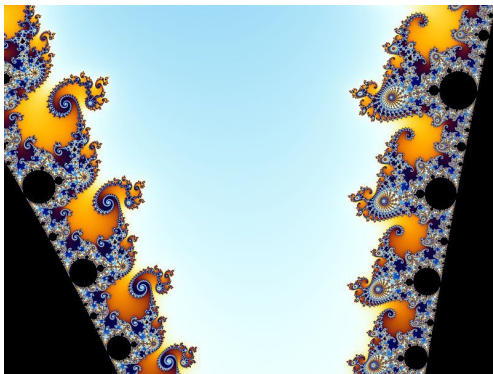


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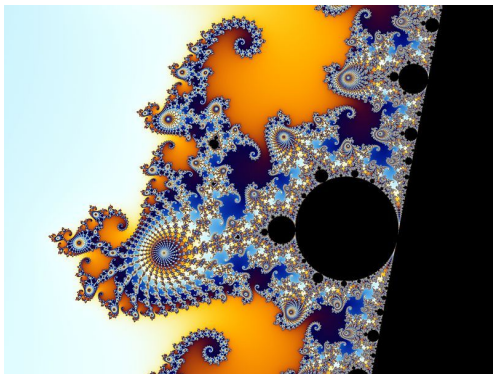


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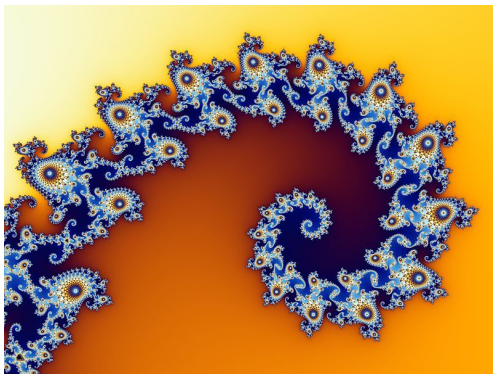


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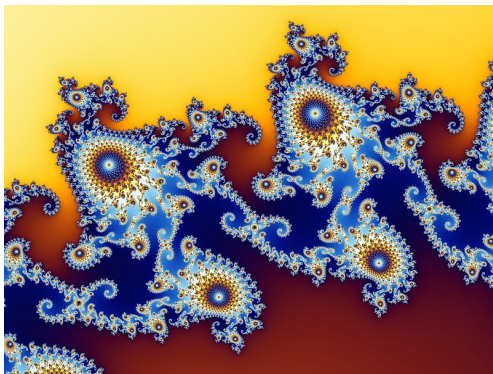


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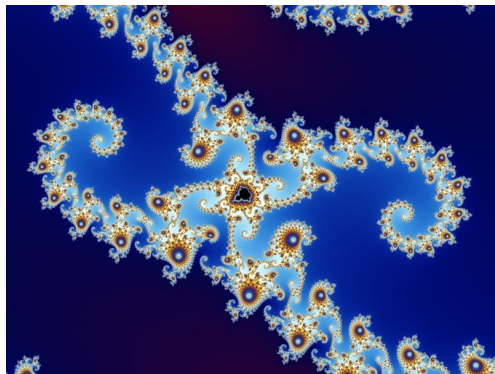
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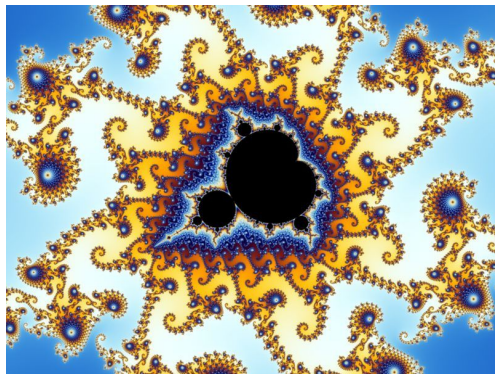
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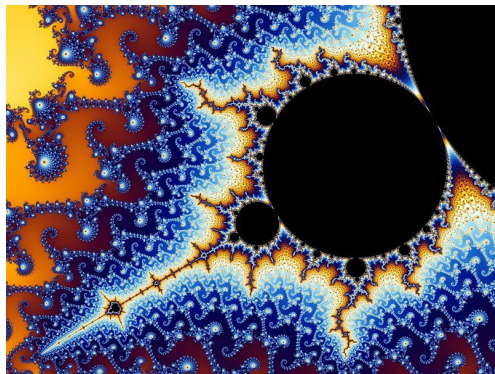
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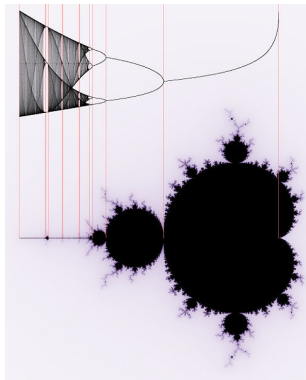
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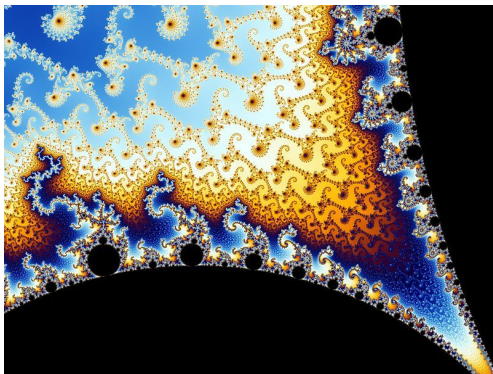


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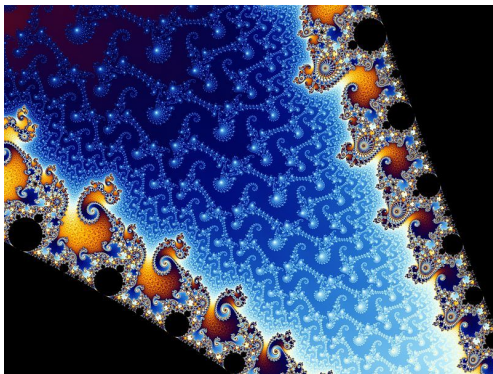


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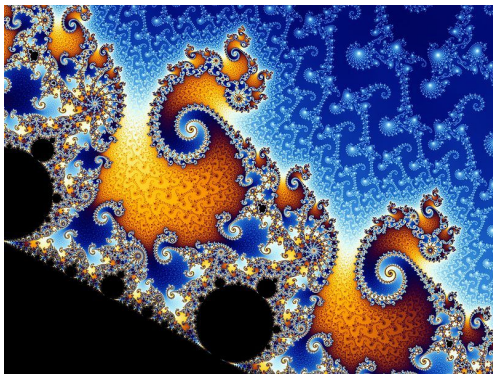
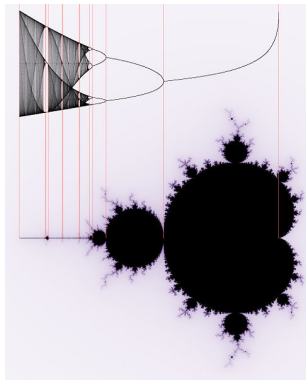
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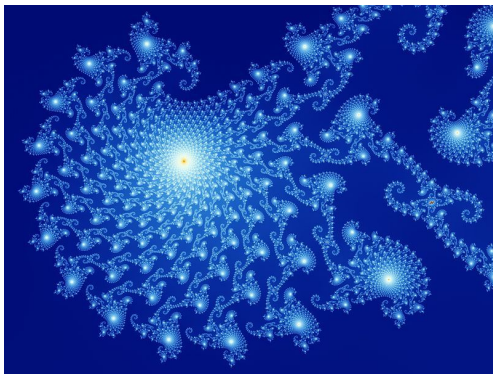


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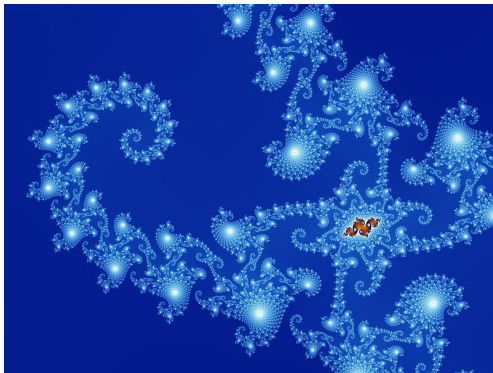


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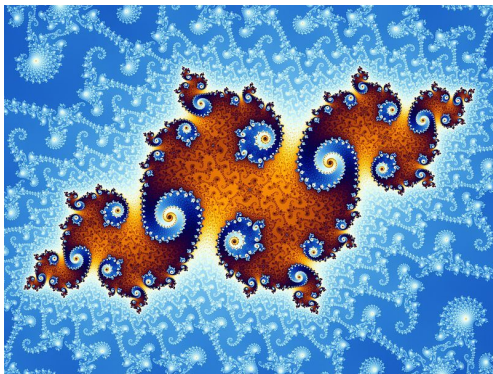


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# General questions

Numerical picture of bifurcation diagram for logistic maps raises questions:

- 1 Various phenomena are suggested by numerics: **period-doubling cascades, windows of stability, self-similarity, chaos**. Can their existence be proved rigorously?
- 2 Qualitative behaviour depends on parameter. How large are the parameter sets on which different behaviours occur?
- 3 Can consider other one-parameter families of interval maps  $f_\lambda: [0, 1] \rightarrow [0, 1]$ . Does the same story happen here?
- 4 What about higher dimensions ( $f_\lambda: \mathbb{R}^d \rightarrow \mathbb{R}^d$ ) or manifolds ( $f_\lambda: M \rightarrow M$ )?

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- 4 Higher dimensions.  
**Numerics suggest a similar story, but proofs are much harder and most answers are still unknown.**