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# On the relation between dissipativity and the turnpike property

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# Outline

- Dissipativity and strict dissipativity
- The turnpike property and its variants
- Known results
- New results and proof ideas

# System class

We consider **nonlinear discrete time** control systems

$$x_{\mathbf{u}}(n+1) = f(x_{\mathbf{u}}(n), \mathbf{u}(n)), \quad x_{\mathbf{u}}(0) = x$$

with  $x_{\mathbf{u}}(n) \in X$ ,  $\mathbf{u}(n) \in U$ ,  $X, U$  normed spaces

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or of a discrete time model (or a numerical  
approximation of one of these)

Dissipativity and strict dissipativity

# Dissipativity

$$x^+ = f(x, u)$$

Introduce functions  $s : X \times U \rightarrow \mathbb{R}$  and  $\lambda : X \rightarrow \mathbb{R}_0^+$

$s(x, u) \in \mathbb{R}$  **supply rate**, measuring the (possibly negative) amount of energy supplied to the system via the input  $u$  in the next time step

$\lambda(x) \geq 0$  **storage function**, measuring the amount of energy stored inside the system when the system is in state  $x$

# Dissipativity

**Definition** [Willems '72] The system is called **dissipative** if for all  $x \in X$ ,  $u \in U$  the inequality

$$\lambda(x^+) \leq \lambda(x) + s(x, u)$$

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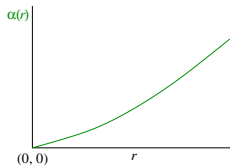
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holds

$\alpha \in \mathcal{K}$ :  $\alpha : \mathbb{R}_0^+ \rightarrow \mathbb{R}_0^+$ , continuous,  
strictly increasing,  $\alpha(0) = 0$



# Physical interpretation of dissipativity

$$\lambda(x^+) \leq \lambda(x) + s(x, u) \quad [ - \alpha(\|x - x^e\|) ]$$

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**strict dissipativity:** a certain amount of energy, depending on  $\|x - x^e\|$  **must be dissipated**

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Translation to **discrete time systems** is quite straightforward  
[Byrnes/Lin '94]

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Constructing  $F$  is particularly easy in case of **passivity**, because for  $s(x, u) = \langle y, u \rangle$  it suffices to define the output feedback  $F(y) := -y$

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In both cases,  $\lambda$  is a **Lyapunov function**

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Finally, strict dissipativity plays a major role in the analysis of so called **economic model predictive control** schemes (details later)

# Available storage

**Theorem** [Willems '72, Byrnes/Lin '94] A system is [strictly] dissipative with supply rate  $s$  [and  $\alpha \in \mathcal{K}$ ] if and only if

$$\sup_{K, \mathbf{u}} \sum_{k=0}^{K-1} -s(x_{\mathbf{u}}(k), \mathbf{u}(k)) \left[ + \alpha(\|x_{\mathbf{u}}(k) - x^e\|) \right] < \infty$$

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The particular storage function defined above is called  
“available storage”

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We **illustrate** the property by two simple examples

# Example 1: minimum energy control

**Example:** Keep the state of the system inside a given interval  $X$  minimising the quadratic control effort

$$\ell(x, u) = u^2$$

with dynamics

$$x^+ = 2x + u$$

and spaces  $X = [-2, 2]$ ,  $U = [-3, 3]$



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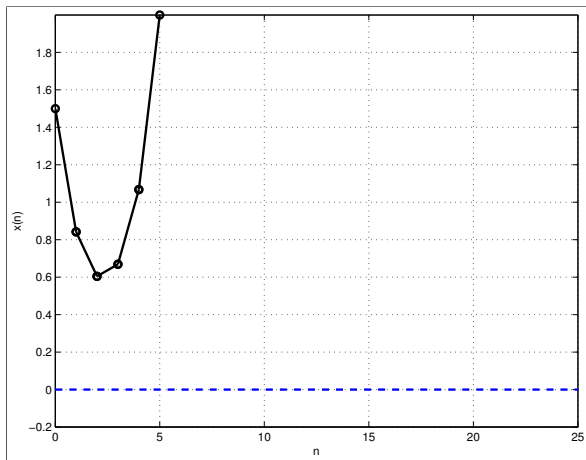
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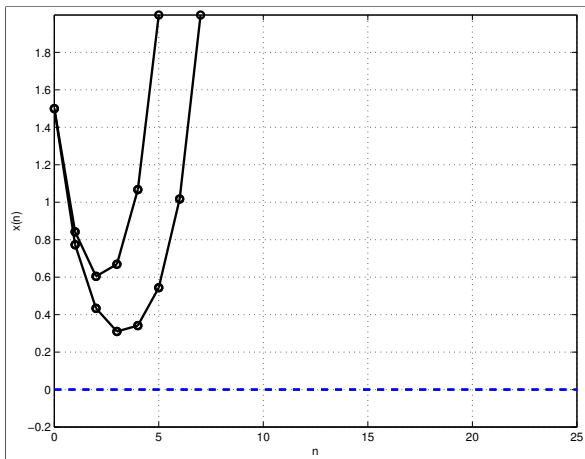
↪ optimal trajectory should stay near  $x^e = 0$

# Example 1: optimal trajectories



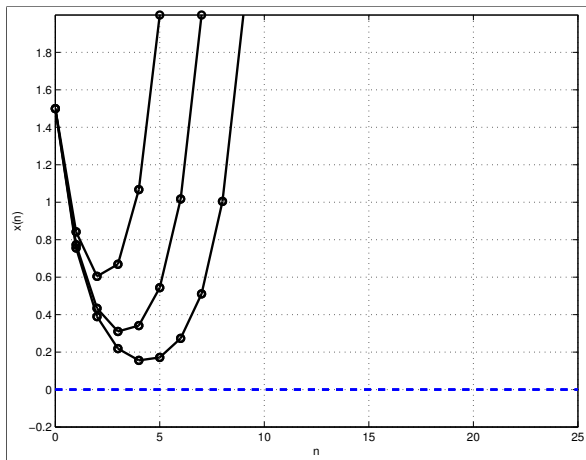
Optimal trajectory for  $N = 5$

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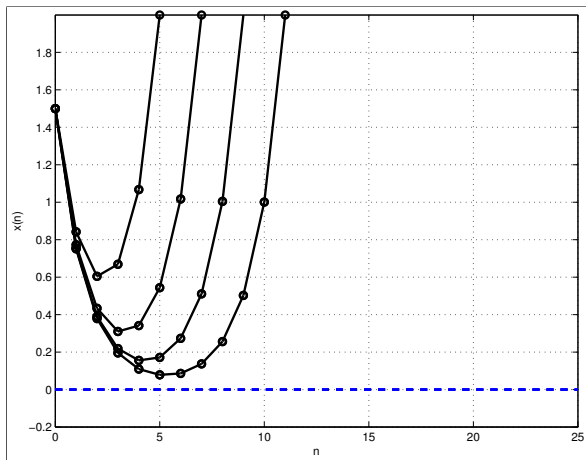
Optimal trajectories for  $N = 5, \dots, 7$

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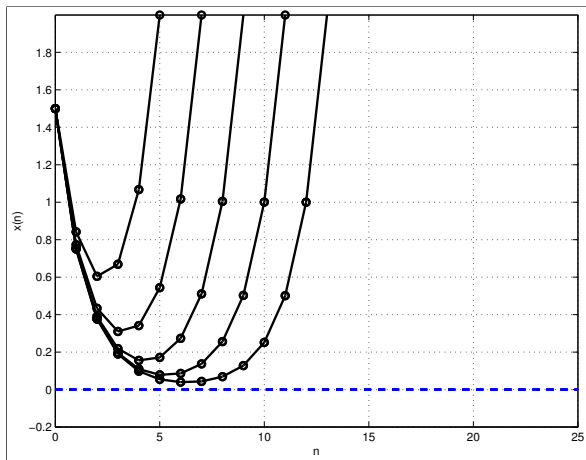
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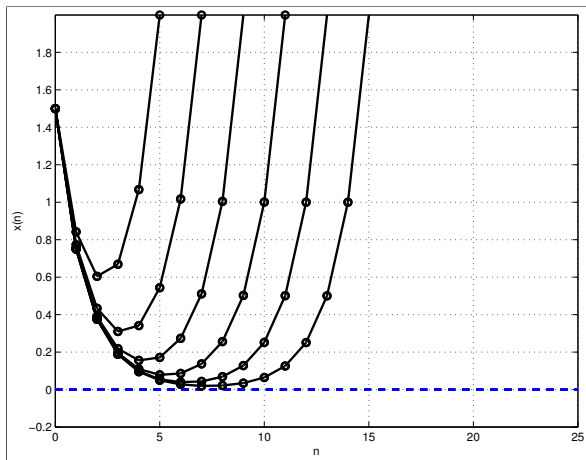
Optimal trajectories for  $N = 5, \dots, 11$

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Optimal trajectories for  $N = 5, \dots, 13$

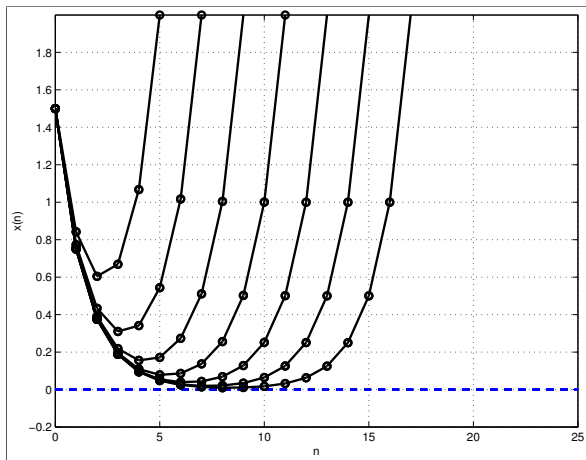
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Optimal trajectories for  $N = 5, \dots, 15$

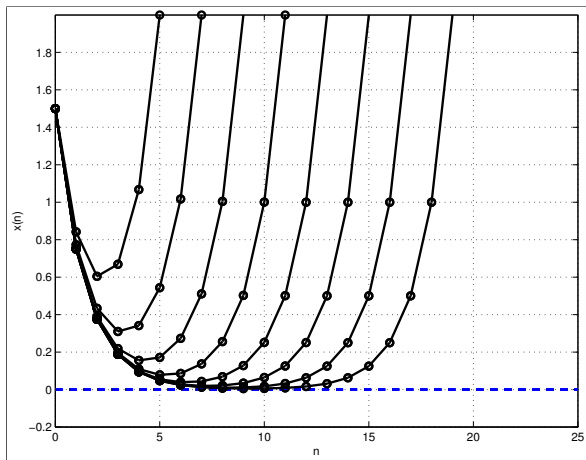


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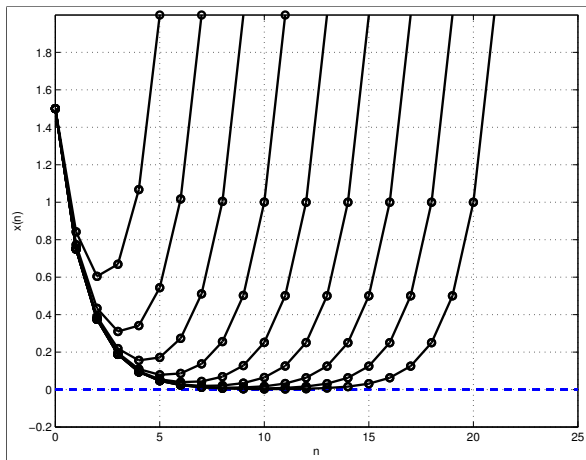
Optimal trajectories for  $N = 5, \dots, 17$

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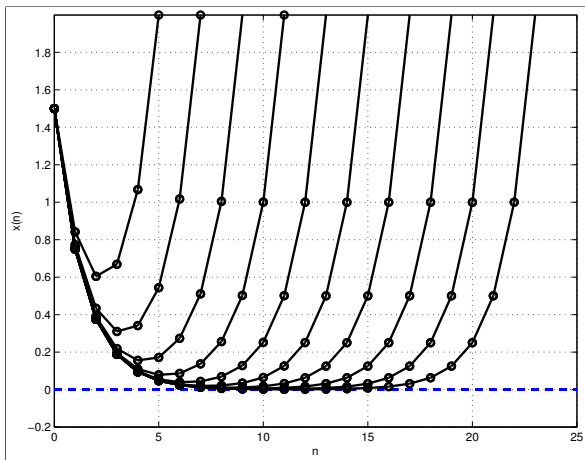
Optimal trajectories for  $N = 5, \dots, 19$

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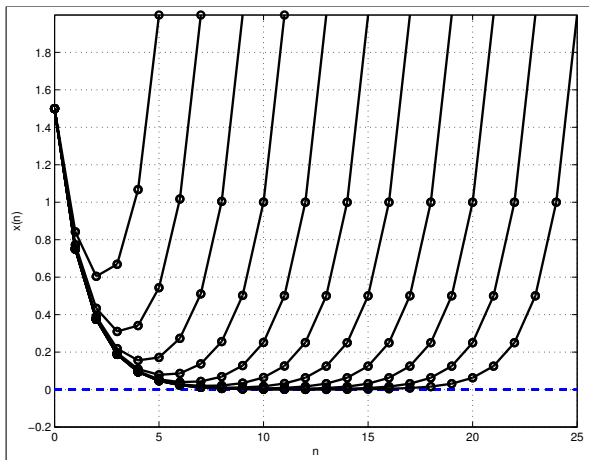
Optimal trajectories for  $N = 5, \dots, 21$

# Example 1: optimal trajectories



Optimal trajectories for  $N = 5, \dots, 23$

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Optimal trajectories for  $N = 5, \dots, 25$

## Example 2: a macroeconomic model

The second example is a 1d macroeconomic model

[Brock/Mirman '72]

Minimise the finite horizon objective with

$$\ell(x, u) = -\ln(Ax^\alpha - u), \quad A = 5, \alpha = 0.34$$

with dynamics  $x^+ = u$

on  $X = U = [0, 10]$

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On infinite horizon, it is **optimal** to stay at the equilibrium

$$x^e \approx 2.2344 \quad \text{with} \quad \ell(x^e, u^e) \approx 1.4673$$



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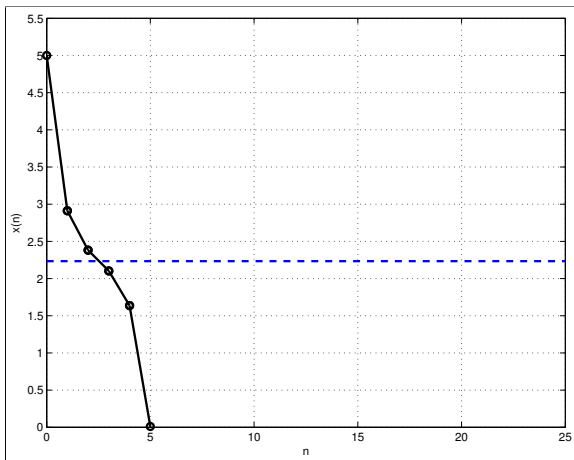
Here the optimal trajectories are **less obvious**

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$$x^e \approx 2.2344 \quad \text{with} \quad \ell(x^e, u^e) \approx 1.4673$$

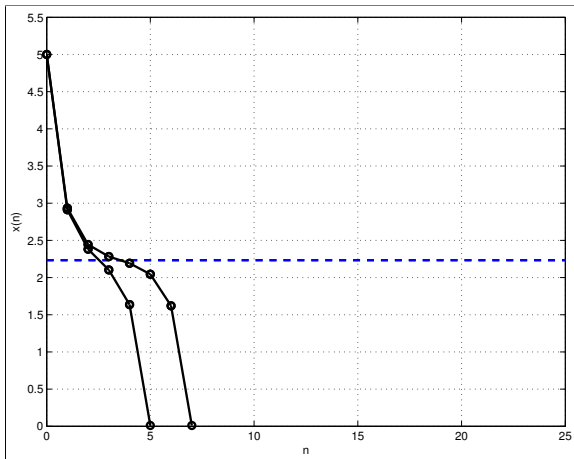
One may thus expect that finite horizon optimal trajectories also **stay for a long time** near that equilibrium

## Example 2: optimal trajectories



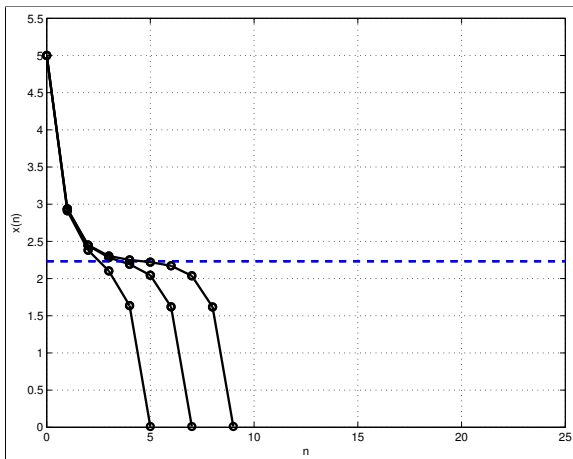
Optimal trajectory for  $N = 5$

## Example 2: optimal trajectories



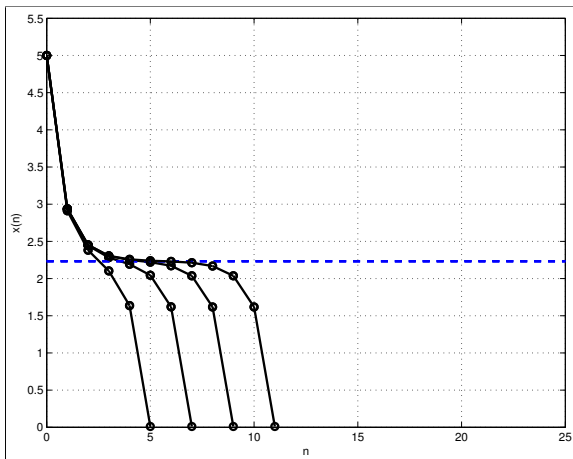
Optimal trajectories for  $N = 5, \dots, 7$

## Example 2: optimal trajectories



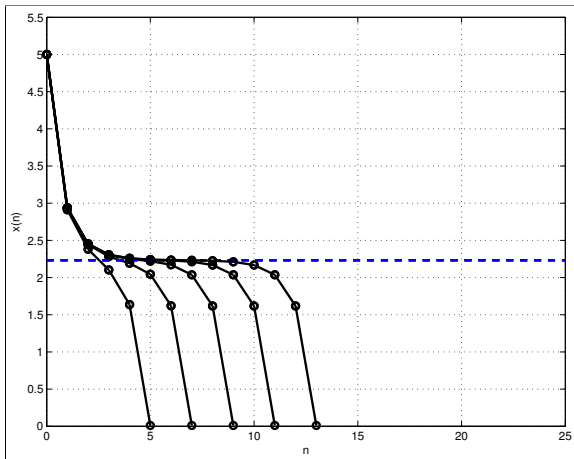
Optimal trajectories for  $N = 5, \dots, 9$

## Example 2: optimal trajectories



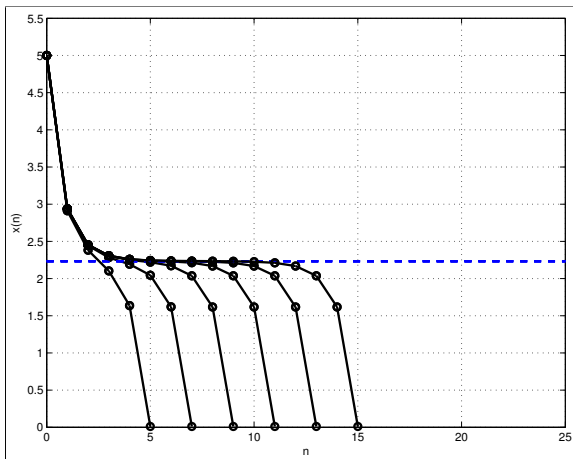
Optimal trajectories for  $N = 5, \dots, 11$

## Example 2: optimal trajectories



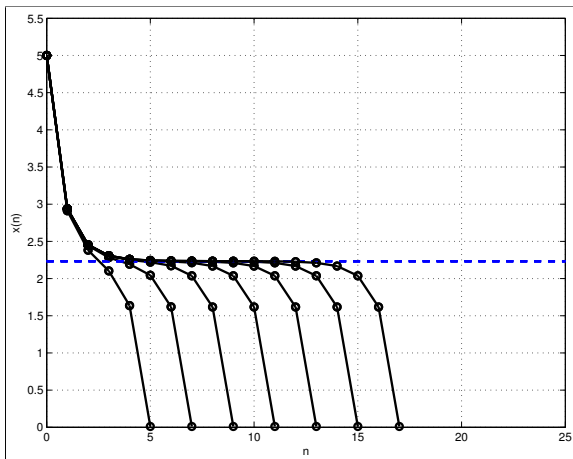
Optimal trajectories for  $N = 5, \dots, 13$

## Example 2: optimal trajectories



Optimal trajectories for  $N = 5, \dots, 15$

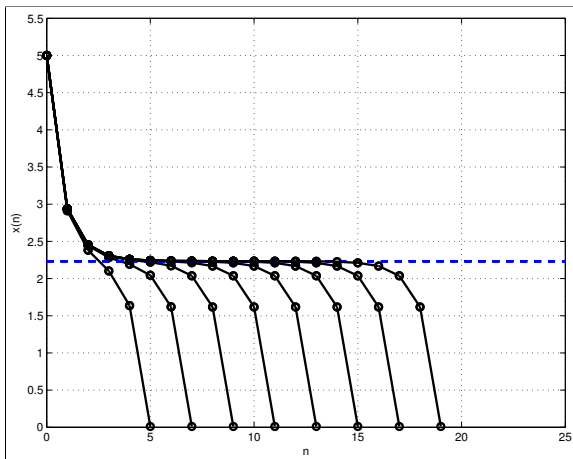
## Example 2: optimal trajectories



Optimal trajectories for  $N = 5, \dots, 17$

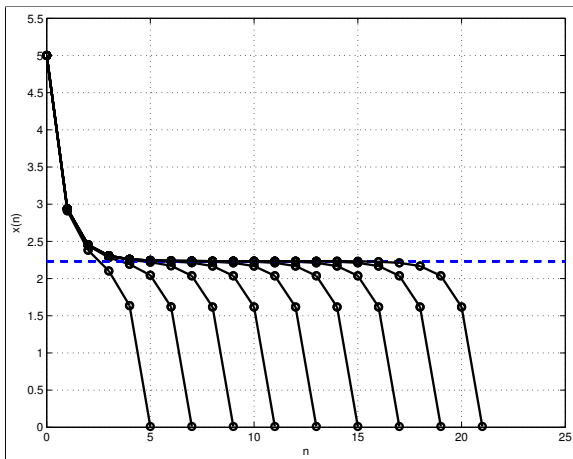


## Example 2: optimal trajectories



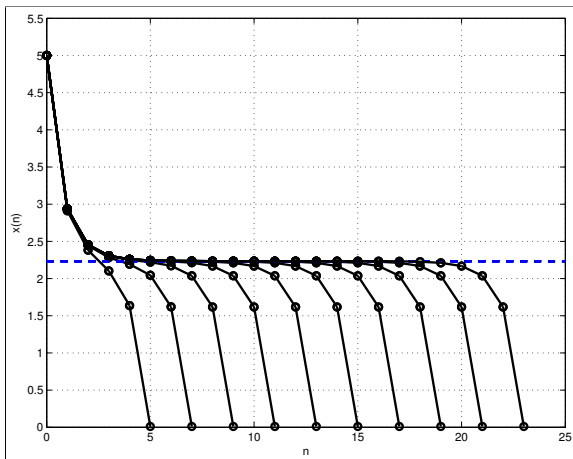
Optimal trajectories for  $N = 5, \dots, 19$

## Example 2: optimal trajectories



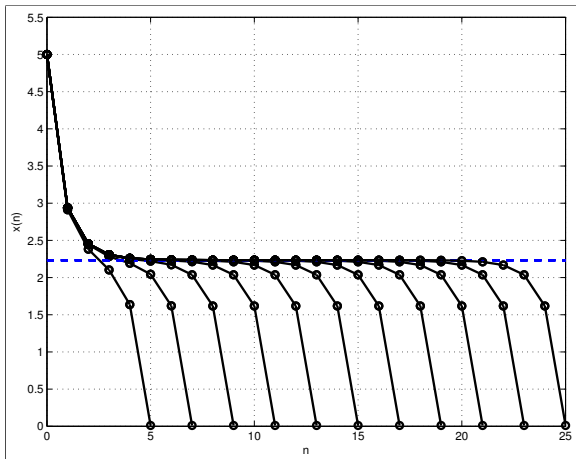
Optimal trajectories for  $N = 5, \dots, 21$

## Example 2: optimal trajectories



Optimal trajectories for  $N = 5, \dots, 23$

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Optimal trajectories for  $N = 5, \dots, 25$

# The turnpike property: formal definitions

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**Turnpike property:** There is  $C > 0$  and  $\rho \in \mathcal{K}_\infty$  such that for all  $x \in X$  and  $N \in \mathbb{N}$ , all optimal trajectories  $x^*$  with  $x^*(0) = x$  and all  $\varepsilon > 0$ , the number

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**Near optimal turnpike property:** There is  $C > 0$  and  $\rho \in \mathcal{K}_\infty$  such that for all  $x \in X$ ,  $N \in \mathbb{N}$  and  $\delta > 0$ , all trajectories  $x_{\mathbf{u}}$  with  $J_N(x, \mathbf{u}) \leq V_N(x) + \delta$  and all  $\varepsilon > 0$ , the number

$$Q_\varepsilon := \#\{k \in \{0, \dots, N-1\} \mid \|x_{\mathbf{u}}(k) - x^e\| \leq \varepsilon\}$$

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- **Renewed interest** in recent years [Zaslavski '14, Trélat/Zuazua '15, Faulwasser et al. '15, ...]

# Applications

Economists are interested in the turnpike property because it gives **structural insight** about optimal economic equilibria and the optimal trajectories' tendency to stay near them

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The finite horizon turnpike property at an equilibrium is also closely related to the **convergence of infinite horizon optimal trajectories** towards this equilibrium

# Applications

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Ideas of this type can be found, e.g., in [Anderson/Kokotovic '87]

# Application: Model predictive control

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MPC is a method in which an **optimal control problem on an infinite horizon**

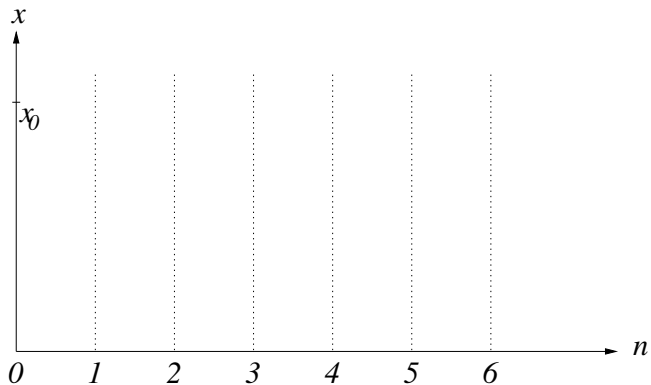
$$\text{minimise } J_{\infty}(x, \mathbf{u}) = \sum_{n=0}^{\infty} \ell(x_{\mathbf{u}}(n), \mathbf{u}(n))$$

is approximated by the **iterative** solution of **finite horizon problems**

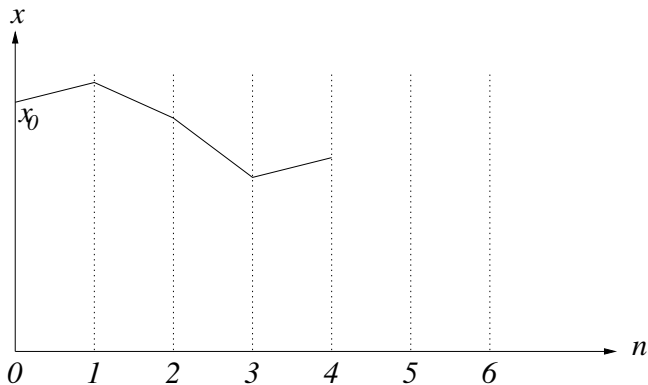
$$\text{minimise } J_N(x, \mathbf{u}) = \sum_{n=0}^{N-1} \ell(x_{\mathbf{u}}(k), \mathbf{u}(k))$$

with fixed  $N \in \mathbb{N}$

# MPC from the trajectory point of view

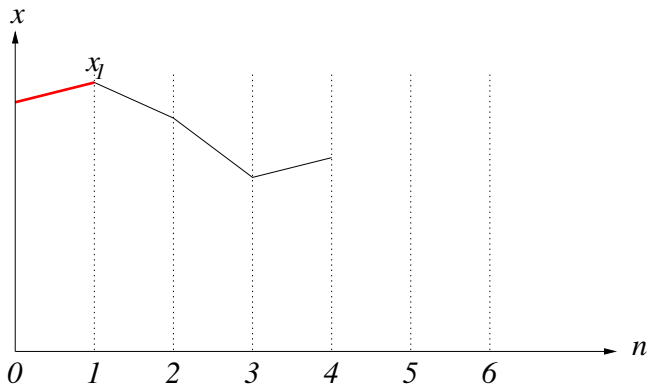


# MPC from the trajectory point of view



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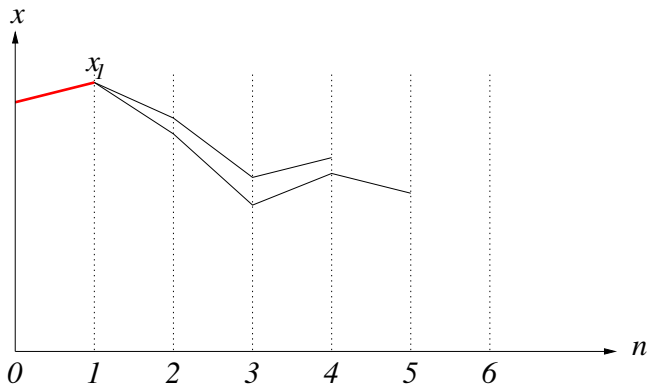
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black = predictions (open loop optimization)

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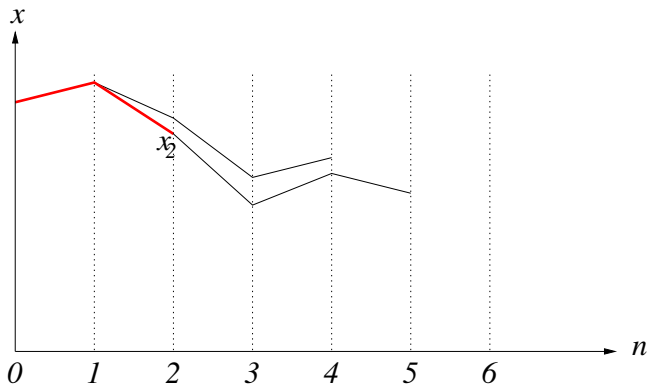
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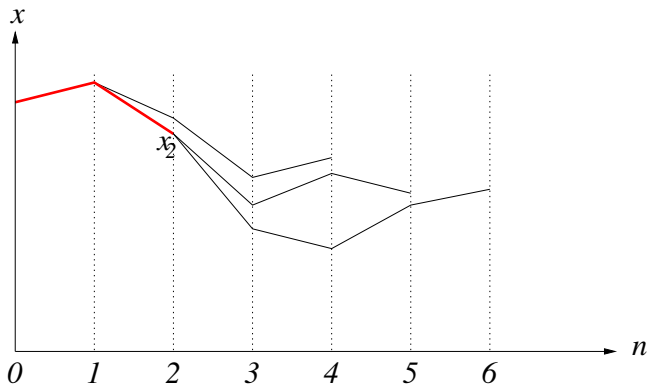


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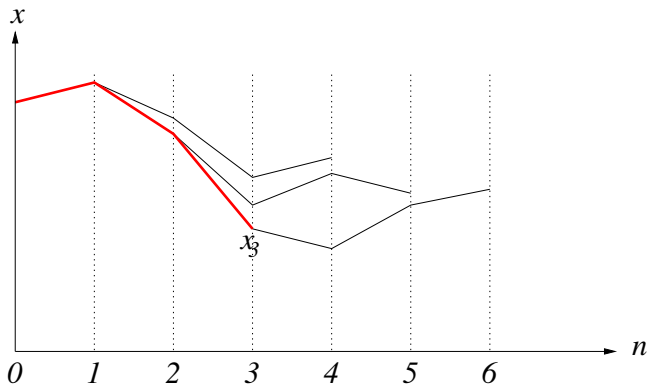
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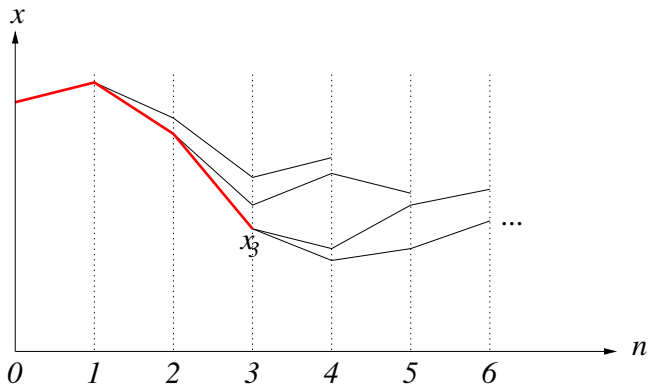
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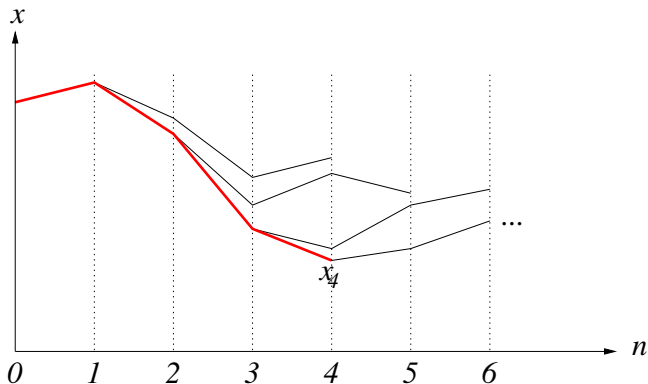
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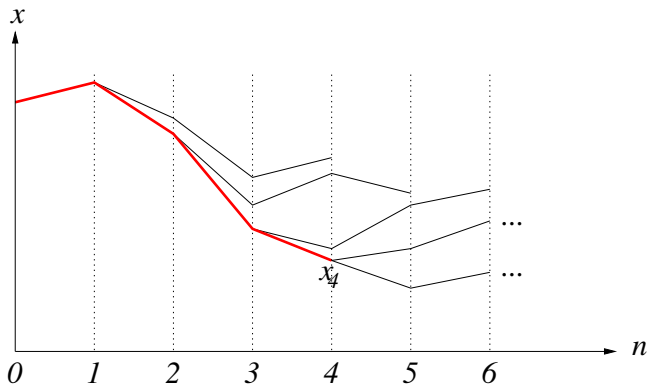
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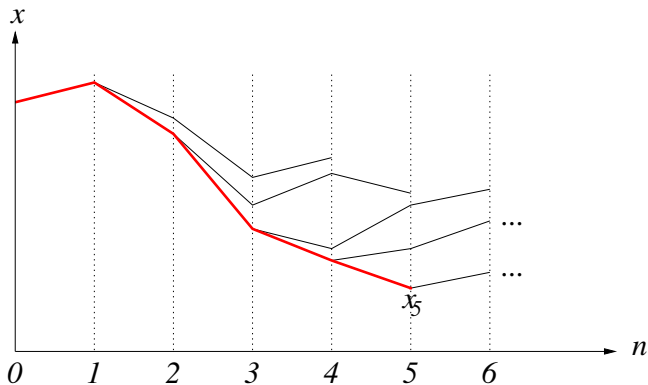
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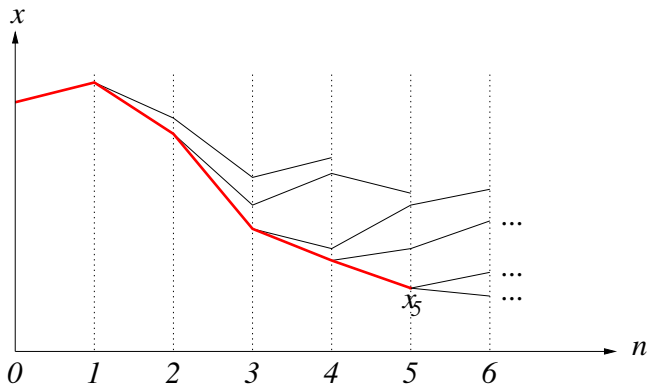
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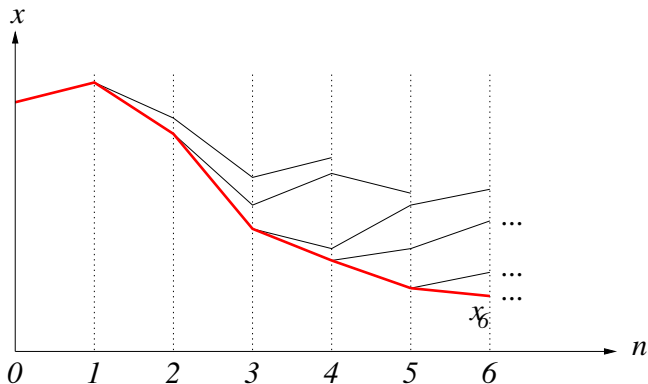
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# Approximation result for MPC

If the finite horizon problems have the **turnpike property**, then a **rigorous approximation result** can be proved

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If the finite horizon problems have the **turnpike property**, then a **rigorous approximation result** can be proved

The results exploits that the “red” closed loop trajectory approximately **follows the first part** of the “black” predictions up to the equilibrium

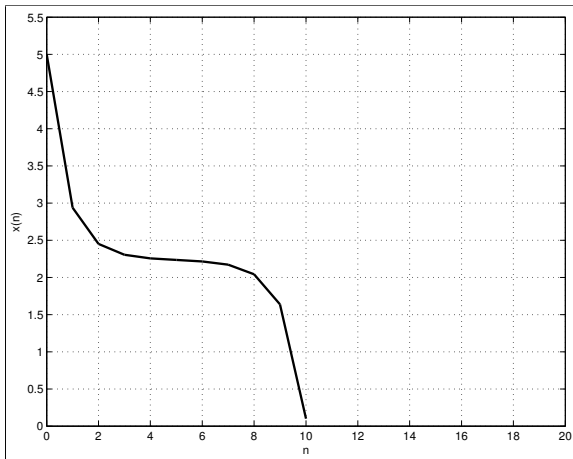
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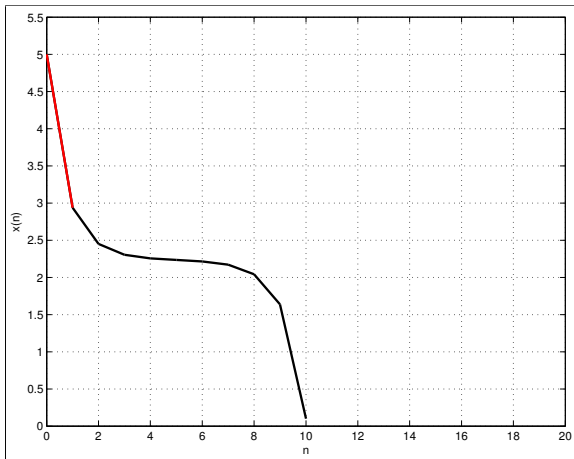
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We **illustrate** this behaviour by our second example for  $N = 10$

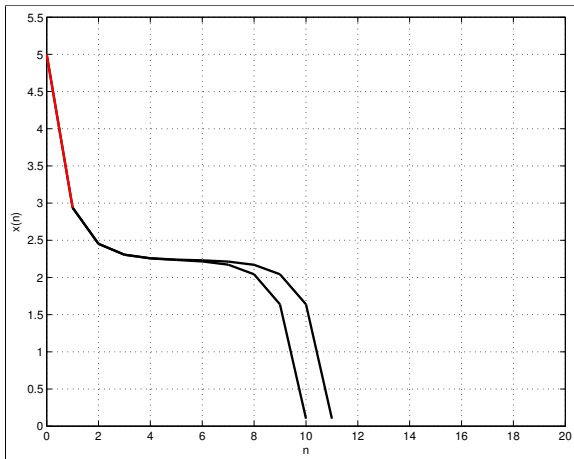
# MPC for Example 2



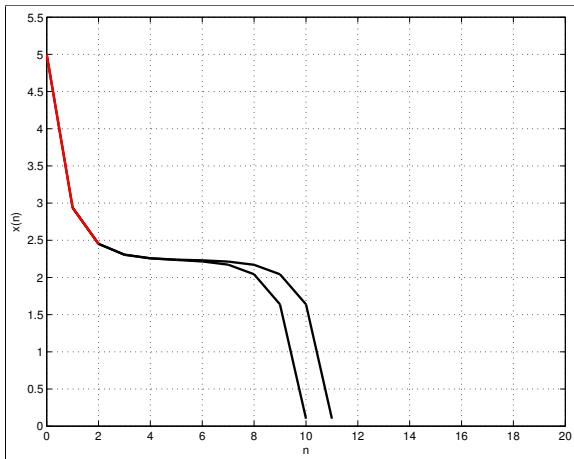
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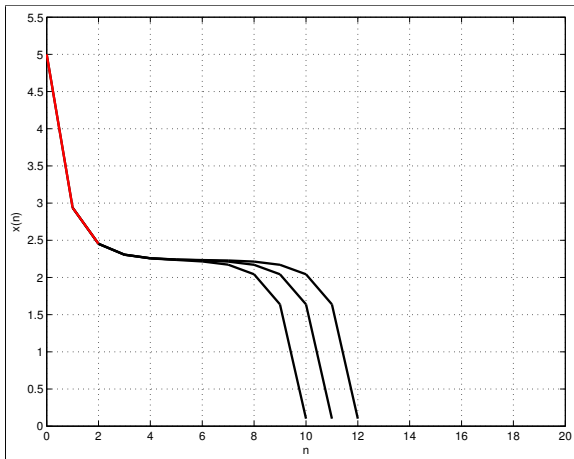
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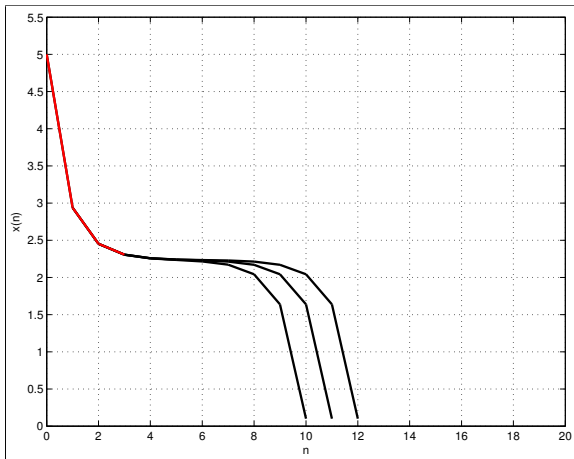


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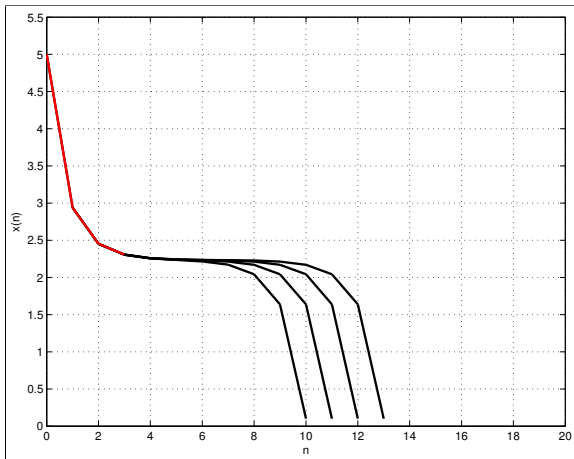




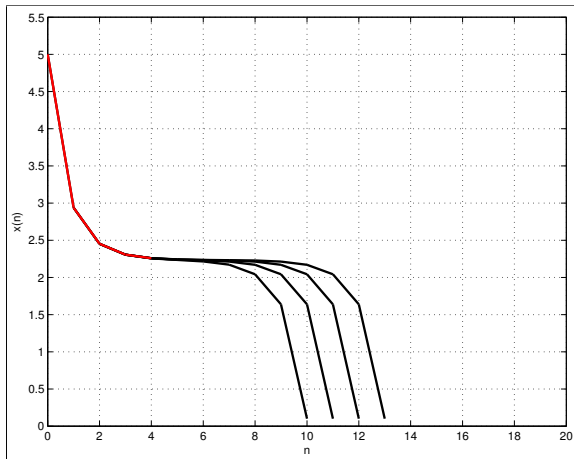
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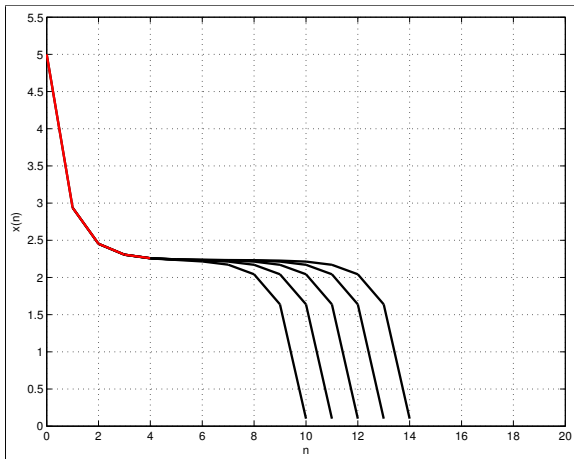
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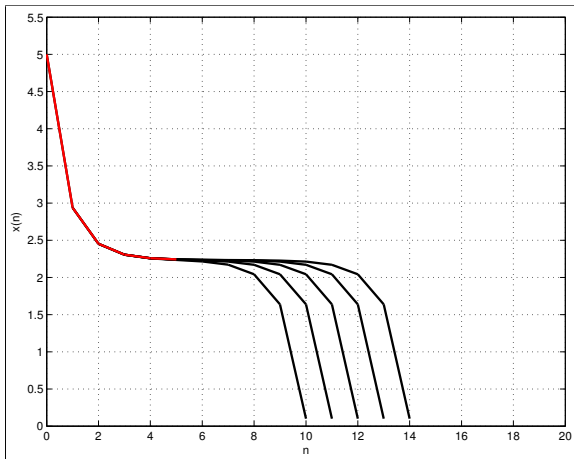
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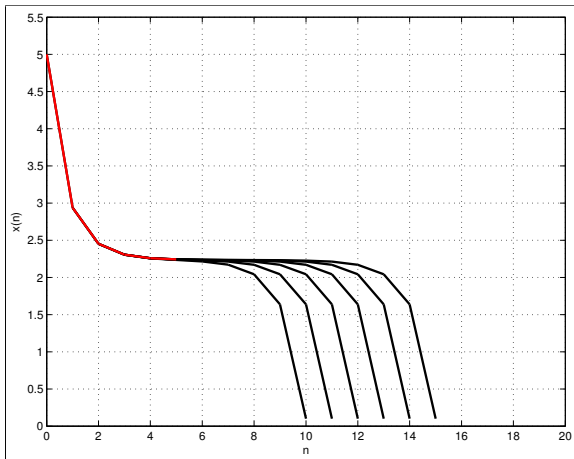
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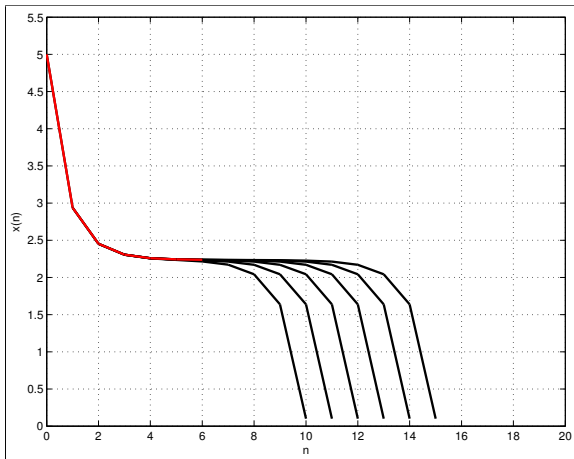
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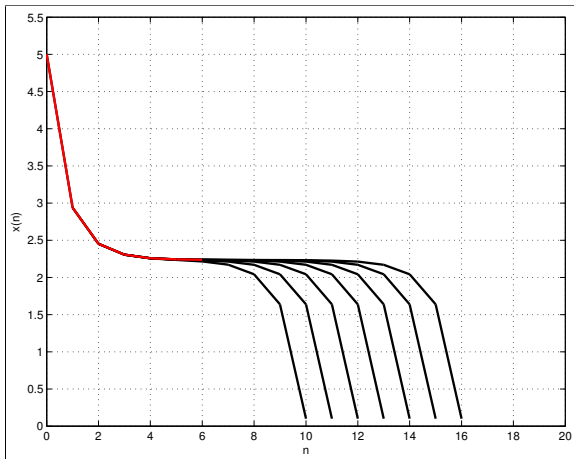
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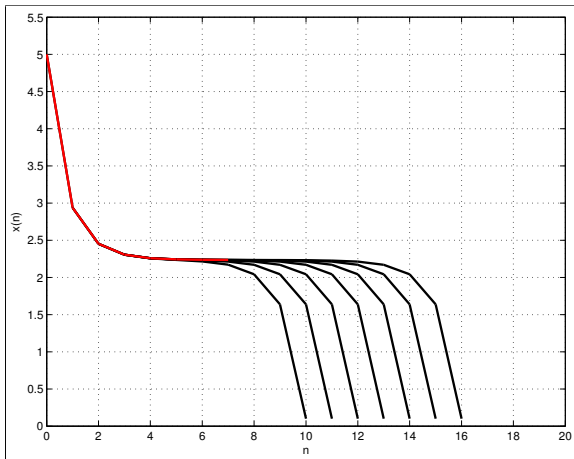


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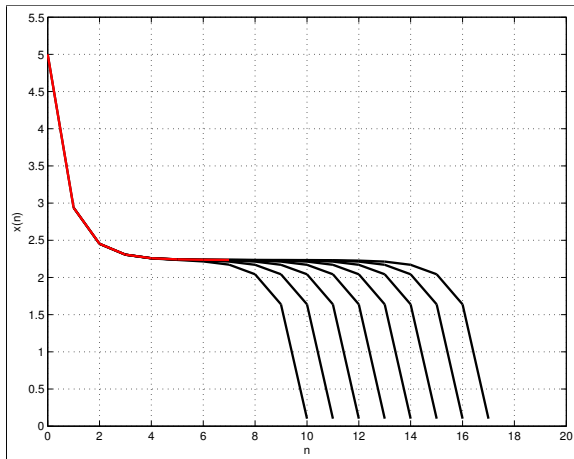




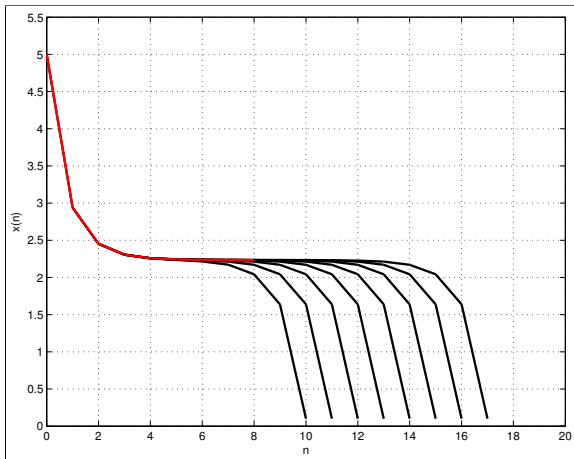
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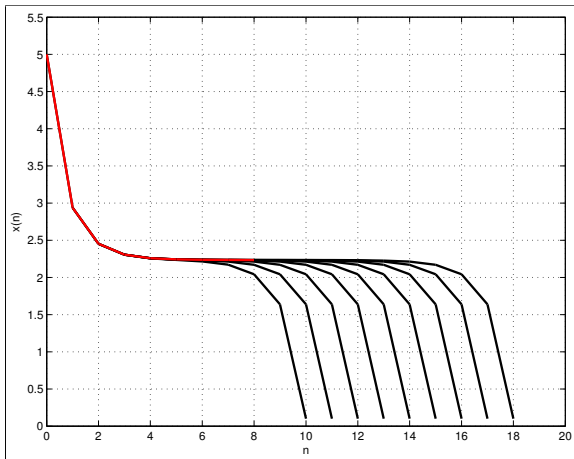
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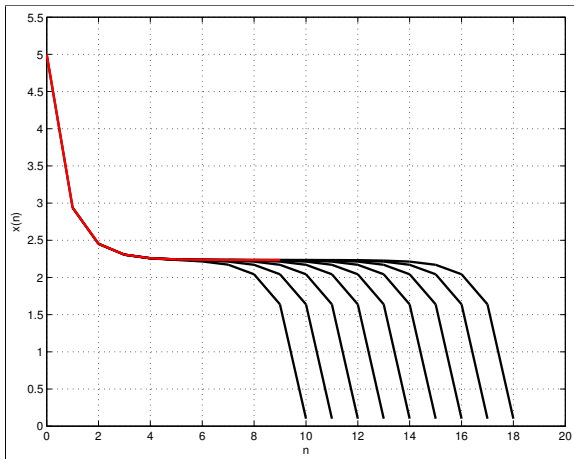
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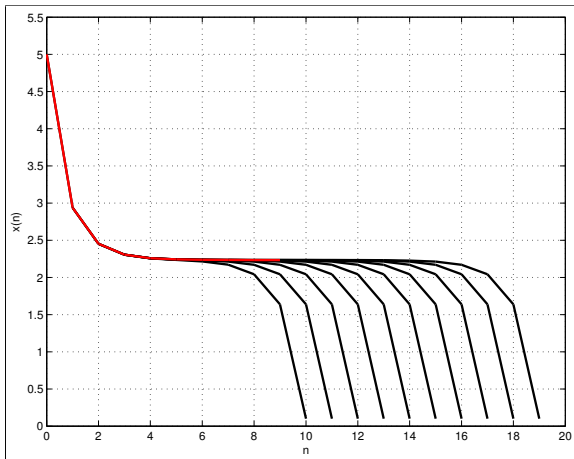
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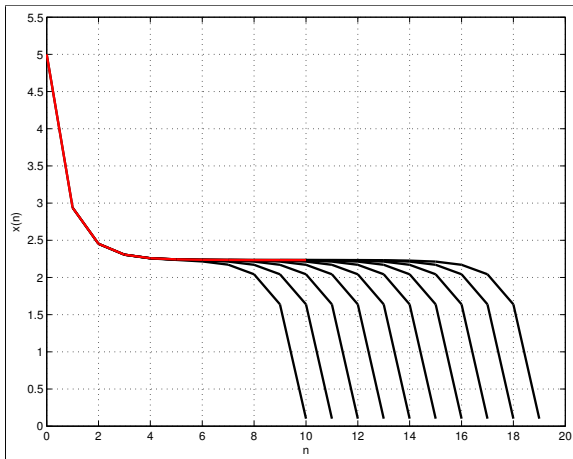
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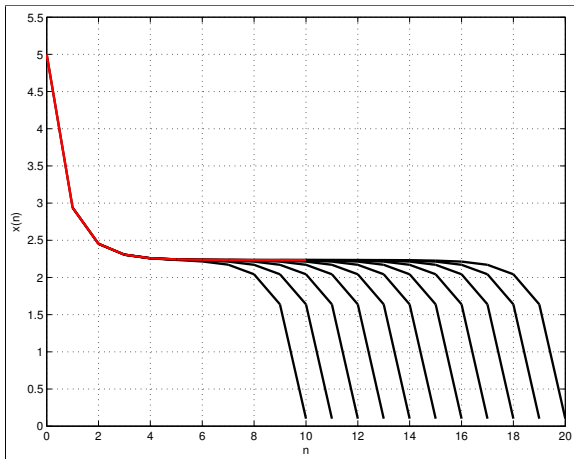
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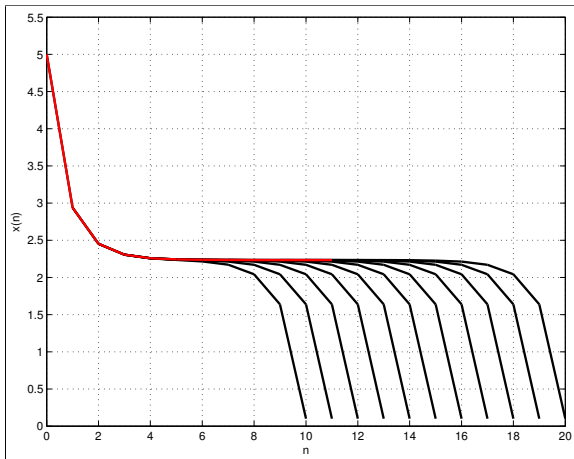


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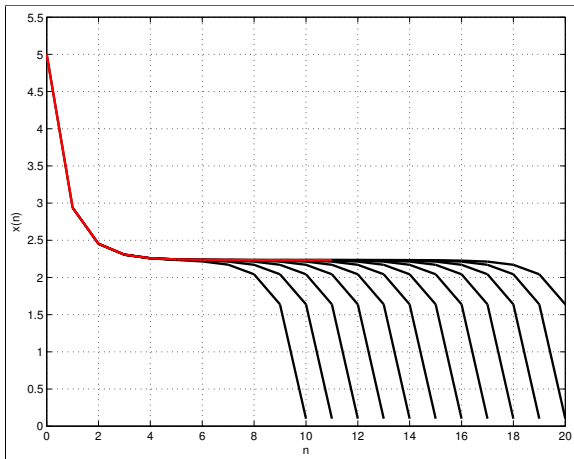




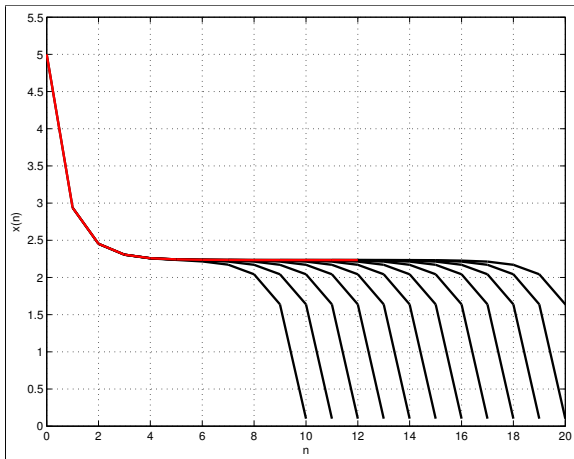
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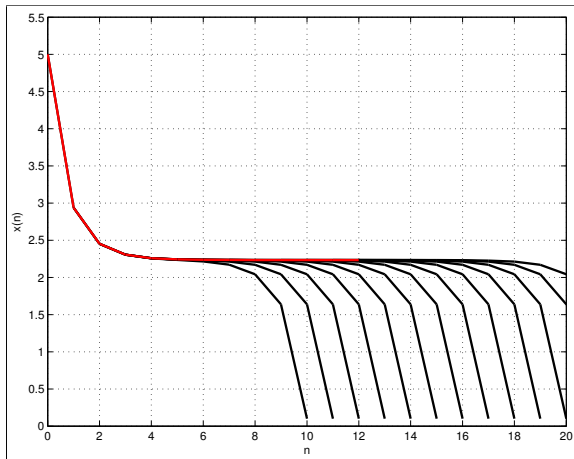
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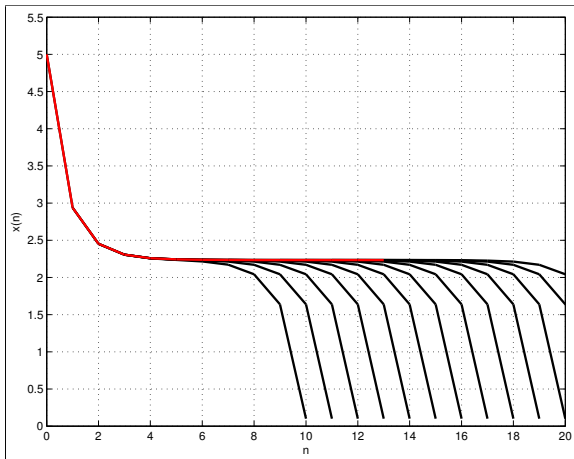
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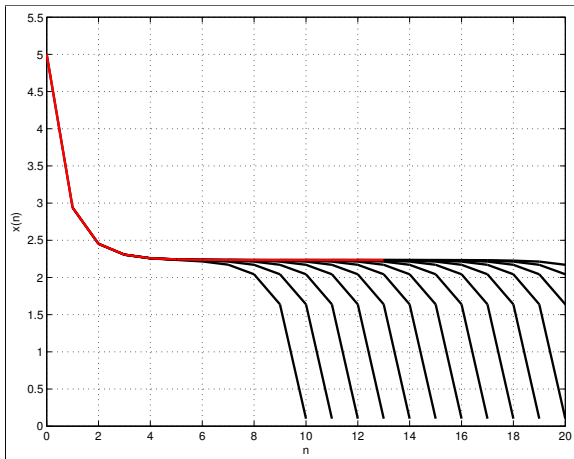
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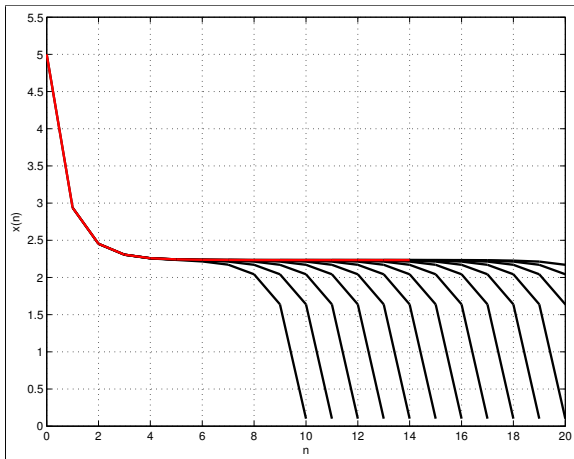
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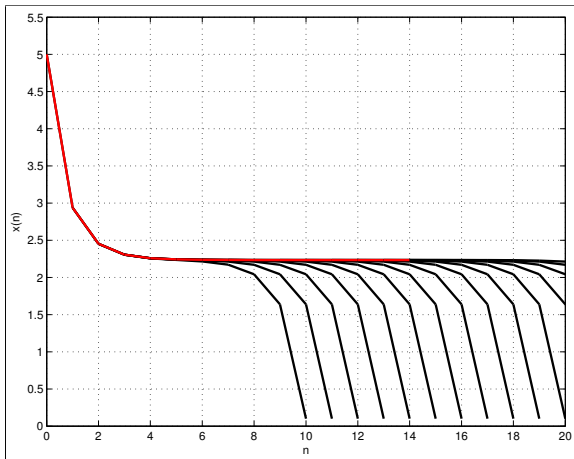
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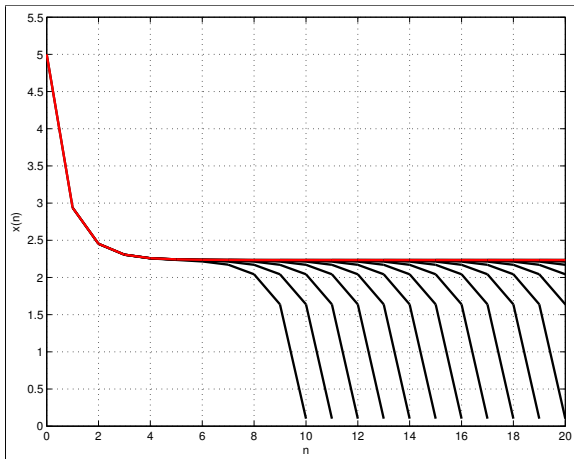


# MPC for Example 2





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Known results

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**Theorem** [Gr. '13] If the system is **strictly dissipative** with supply rate  $s(x, u) = \ell(x, u) - \ell(x^e, u^e)$  and bounded storage function and  $x^e$  is **cheaply reachable**, then the **near optimal turnpike property** holds

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(In fact, similar statements can be found in **earlier papers and monographs**, e.g. in [Carlson/Haurie/Leizarowitz '91])

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**Idea of proof:** Strict dissipativity implies that the **rotated cost**

$$\tilde{\ell}(x, u) = \ell(x, u) - \ell(x^e, u^e) + \lambda(x) - \lambda(f(x, u))$$

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satisfies  $\tilde{\ell}(x, u) \geq \alpha(\|x - x^e\|)$ . Boundedness of  $\lambda$  implies that

$$J_N(x, \mathbf{u}) = \sum_{k=0}^{N-1} \ell(x_{\mathbf{u}}(k), \mathbf{u}(k)) \text{ and } \tilde{J}_N(x, \mathbf{u}) = \sum_{k=0}^{N-1} \tilde{\ell}(x_{\mathbf{u}}(k), \mathbf{u}(k))$$

differ only by a **constant independent of  $N$**

# Known results

We say that  $x^e$  is cheaply reachable if there is  $E > 0$  such that  $V_N(x) \leq N\ell(x^e, u^e) + E$  for all  $x \in X$ ,  $N \in \mathbb{N}$

**Theorem** [Gr. '13] If the system is **strictly dissipative** with supply rate  $s(x, u) = \ell(x, u) - \ell(x^e, u^e)$  and bounded storage function and  $x^e$  is **cheaply reachable**, then the **near optimal turnpike property** holds

**Idea of proof:** Strict dissipativity implies that the **rotated cost**

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$\Rightarrow$  if  $x_{\mathbf{u}}$  stays away from  $x^e$  for  $K \leq N$  steps,  $J_N(x, \mathbf{u}) - N\ell(x^e, u^e)$  grows unboundedly as  $K \rightarrow \infty$ , **contradicting** near optimality



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In fact, the theorem just presented relies on **another theorem** which does not require cheap reachability

# Known results

**Near equilibrium turnpike property:** There is  $C > 0$  and  $\rho \in \mathcal{K}_\infty$  such that for all  $x \in X$ ,  $N \in \mathbb{N}$  and  $\delta > 0$ , all trajectories  $x_{\mathbf{u}}$  with  $J_N(x, \mathbf{u}) \leq N\ell(x^e, u^e) + \delta$  and all  $\varepsilon > 0$ , the number

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New results

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- (c) The **near equilibrium turnpike property** holds **and** the system is **dissipative** with supply rate  $s(x, u) = \ell(x, u) - \ell(x^e, u^e)$  and bounded storage function

In other words, the near equilibrium turnpike property exactly closes the **gap between dissipativity and strict dissipativity**

# Proof idea

We need to prove the equivalences of

- (a) strict dissipativity
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**Question:** Can we get rid of dissipativity in (c)?

Yes, if we use that the near equilibrium turnpike property induces an averaged form of optimality of  $x^e$  which under additional conditions implies dissipativity

[Müller '14, Müller/Angeli/Allgöwer '13]

## New result II

**Corollary:** Assume  $X$  is closed and  $U$  is compact,  $\ell$  is continuous and bounded from below,  $x^e$  is an equilibrium around which the system is locally controllable and  $u^e \in \operatorname{argmin}\{\ell(x^e, u) \mid x^e \in X, f(x^e, u) = x^e\}$

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**Question:** Is local controllability **really needed**?

## Example

$$x^+ = \frac{1}{2}x \quad \text{and} \quad \ell(x, u) = u^2 + \frac{\log 2}{\log |x|}$$

The system has (all three kinds of) the turnpike property at  $x^e = 0$ , because **all solutions converge to 0**



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$$\lambda(x) := \sup_{K, u} \sum_{k=0}^{K-1} -\left(\ell(x(k), u(k)) - \ell(x^e, u^e)\right) = \infty,$$

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Since all other assumptions of the previous corollary are satisfied, it is the **lack of controllability** which makes its statement fail

# Towards new result III

Recall the first two equivalences in the first theorem:

**Theorem:** The following statements are **equivalent**

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Can we replace the near equilibrium turnpike property by the (more intuitive and “classical”) **near optimal turnpike property**?

Yes, but again we need **additional assumptions**

## New result III

**Theorem:** Assume  $\ell$  is bounded and the system is locally controllable around  $x^e$

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**Note:** the implication “(b)  $\Rightarrow$  strict dissipativity” also holds without assuming local controllability

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There is an **obvious analogy** between the equivalences

turnpike property  $\Leftrightarrow$  existence of a storage function

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In contrast, the existence of a Lyapunov function yields asymptotic stability **for all trajectories for which its defining inequality holds**

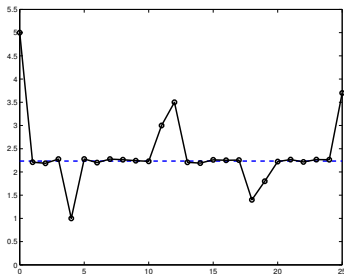
## Application: shape of turnpike trajectories

As usually defined, the turnpike property only limits the **number of time instances** at which the trajectory is outside an  $\varepsilon$ -neighbourhood of  $x^e$

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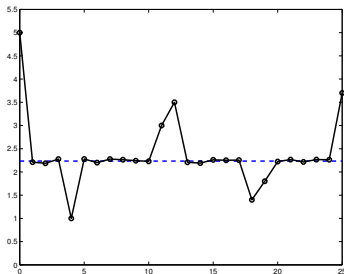
Hence, according to the **definition**, a turnpike trajectory could look like this



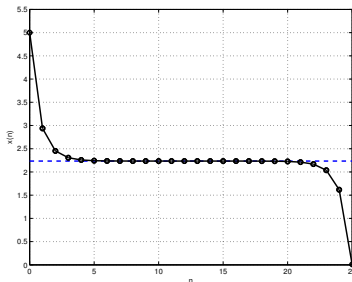
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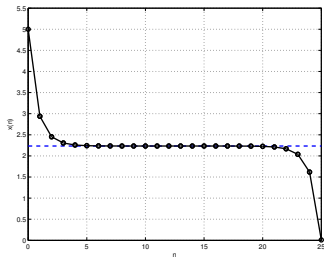
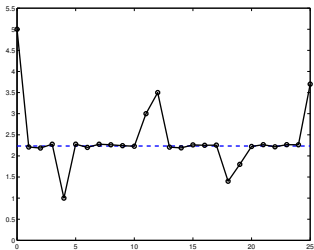


However, in practice in many examples turnpike trajectories look like this

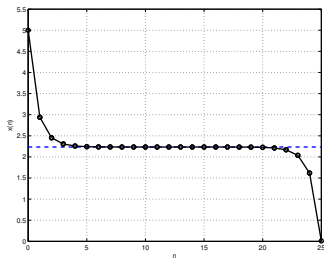
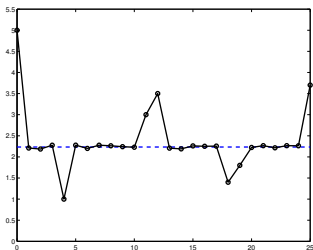




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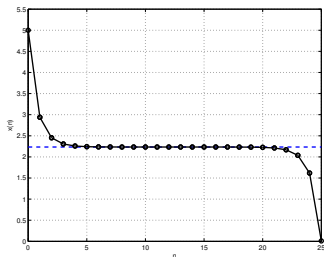
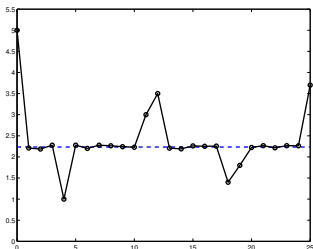


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This is because under the stated conditions the turnpike property implies **strict dissipativity**, which in turn implies **stability of the optimal trajectories**, in the sense that if  $x^*(k) \approx x^e$  then  $x^*(k+p) \approx x^e$  for  $k, p$  sufficiently small relative to  $N$  [Gr. 13]

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This **excludes excursions from  $x^e$**  except at the end of the optimal trajectory

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- The results **precisely describe the gap** between strict dissipativity and turnpike properties
- As a consequence, assuming strict dissipativity for ensuring the turnpike property **does not seem overly conservative**



## References

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