

Incremental Stability of Discrete-Time First-Order Projection Elements

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[clearly not a talk on learning]

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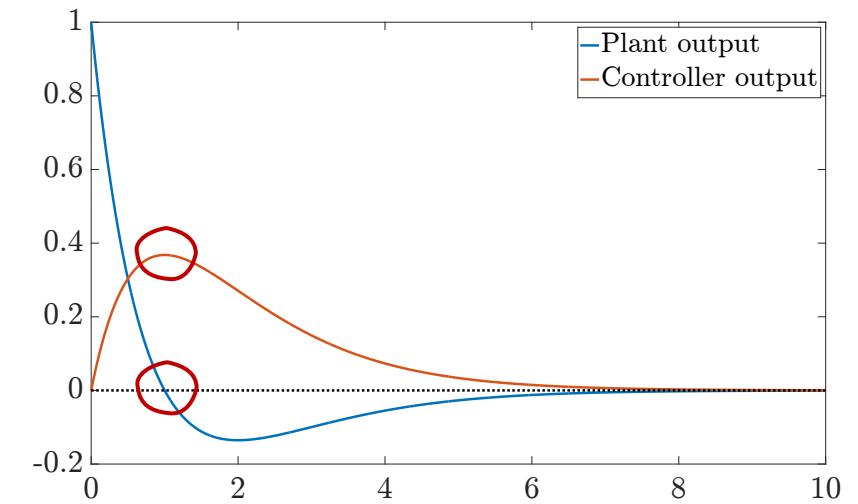
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Motivation: Improving performance of linear controllers

Integrator-based (linear) controllers are needed to reject constant disturbances and overcome friction, but they have some **intrinsic limitations**

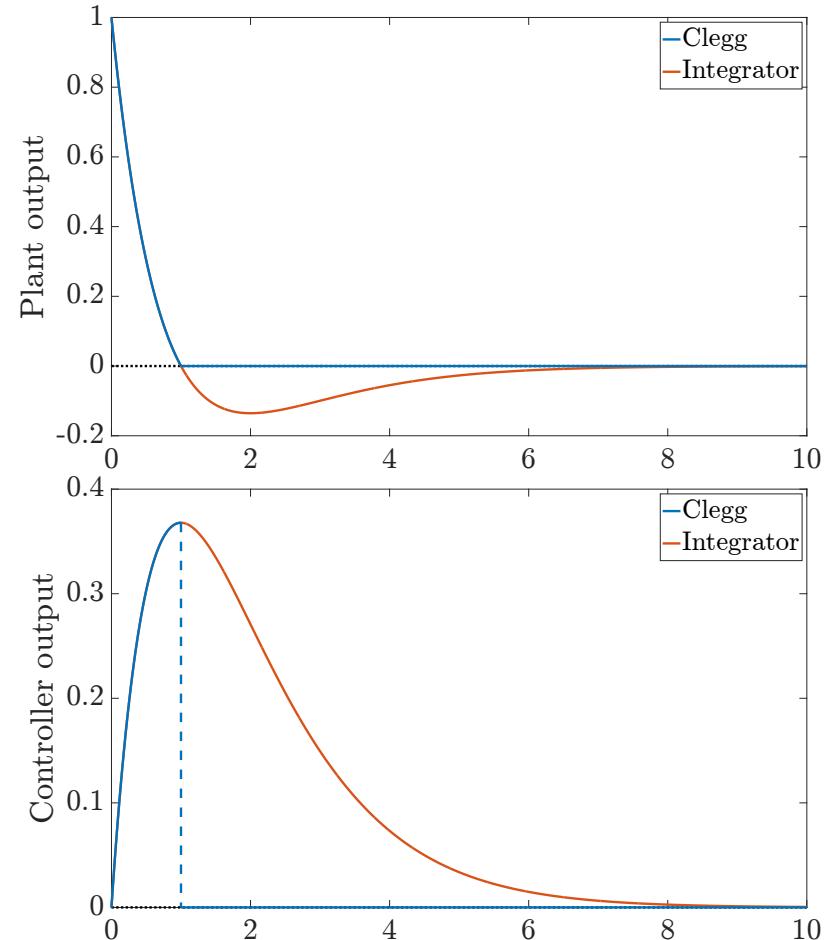


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[Clegg, 1958] proposed the addition of a resetting mechanism

$$\mathcal{H} := \begin{cases} \dot{u} = e, & ue \geq 0 \\ u^+ = 0, & ue < 0 \end{cases}$$



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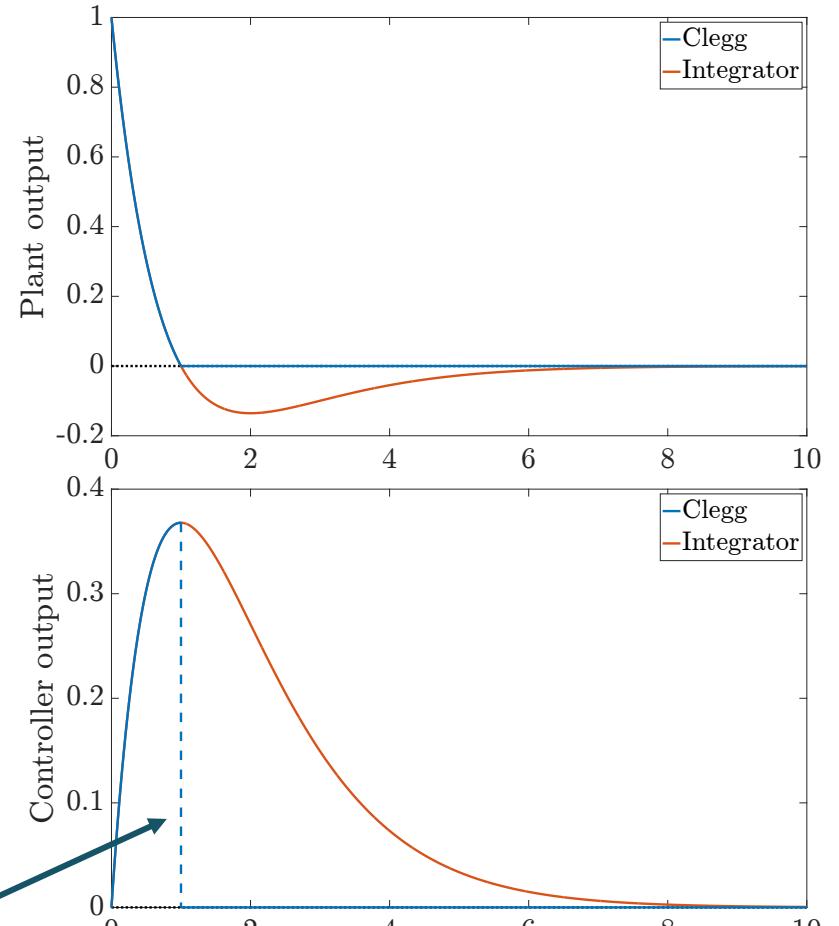
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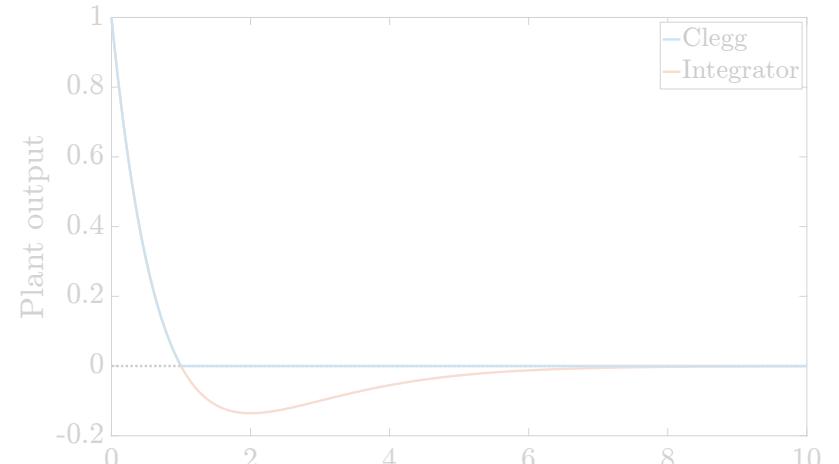
Integrator-based (linear) controllers are needed to reject constant disturbances and overcome friction, but they have some **intrinsic limitations**

[Clegg, 1958] p.

Can we keep the good properties of the controller, but with continuous solutions?

$$\mathcal{H} := \{u^+ = 0, \quad ue < 0$$

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A new approach: Projection-based control

IDEA:

The “good thing” about the Clegg integrator is that $eu \geq 0$

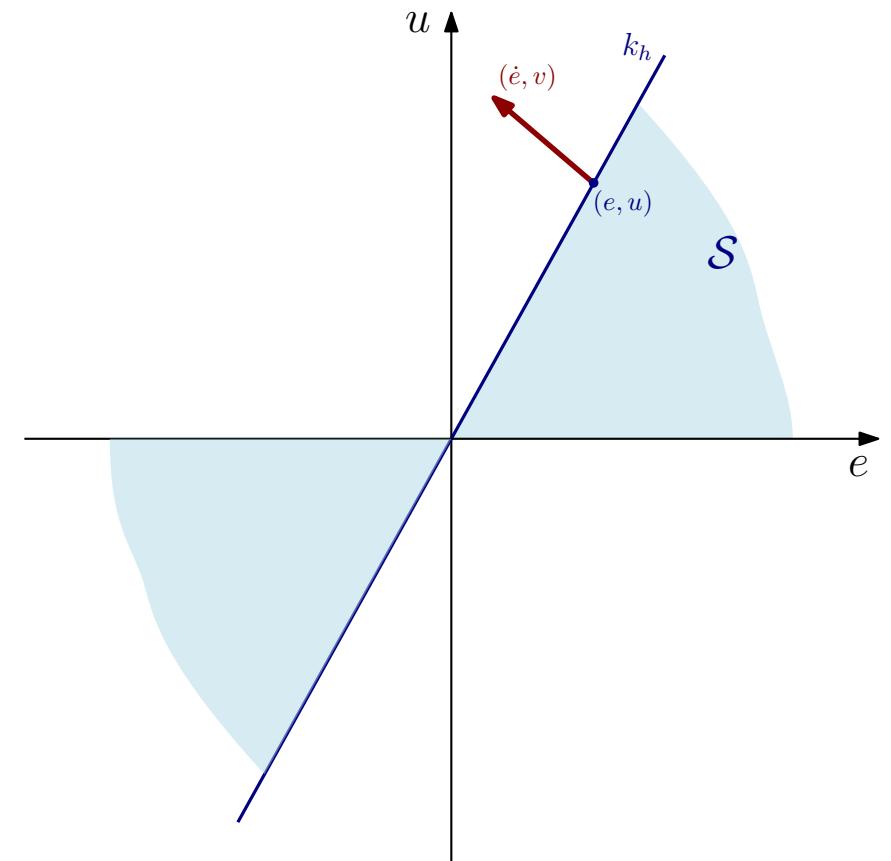
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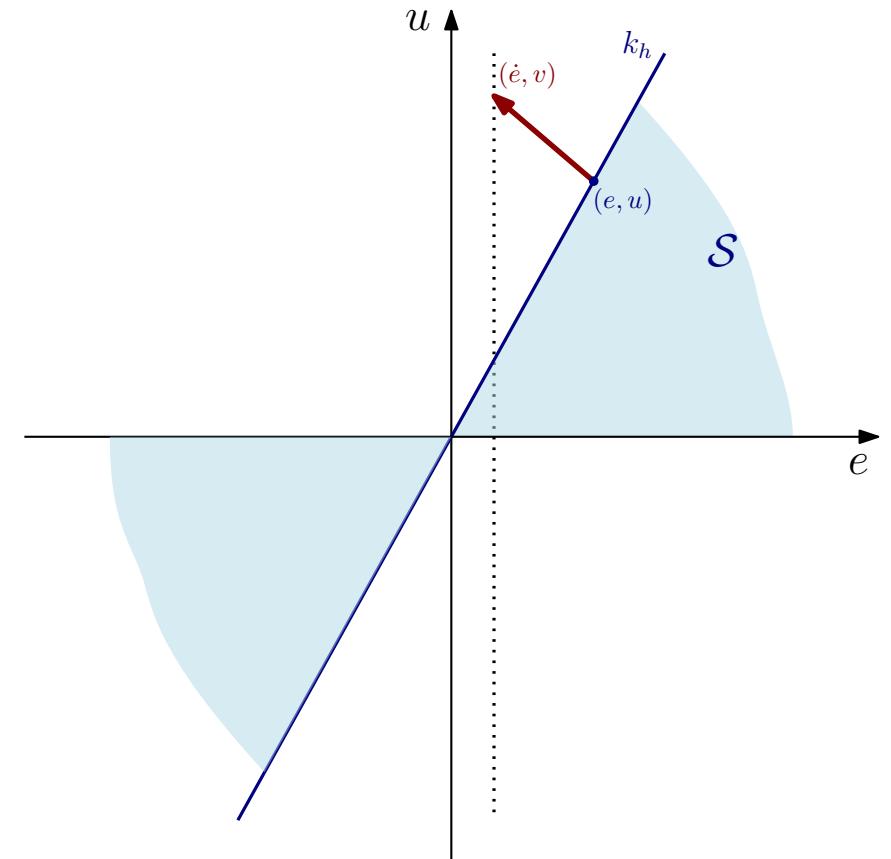


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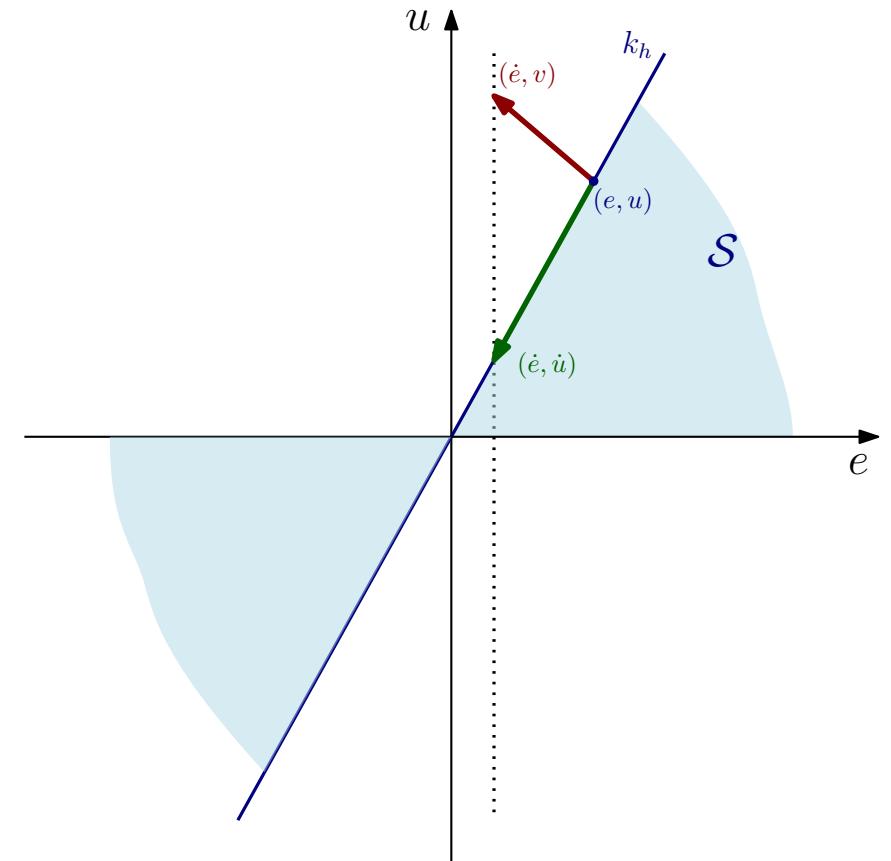


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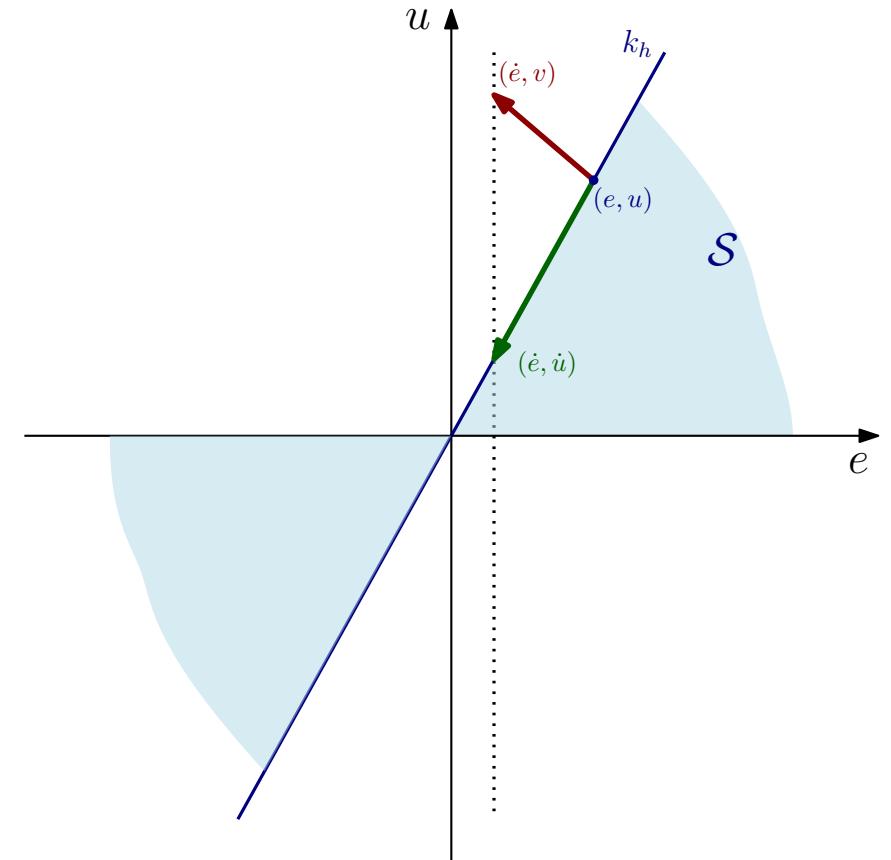
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Hybrid Integrator-Gain Systems (HIGS) [Deenen et al., 2021]

$$\dot{u} = \begin{cases} \omega_h e, & (\omega_h e, \dot{e}) \in T_S(u) \\ k_h \dot{e}, & (\omega_h e, \dot{e}) \notin T_S(u) \end{cases}$$



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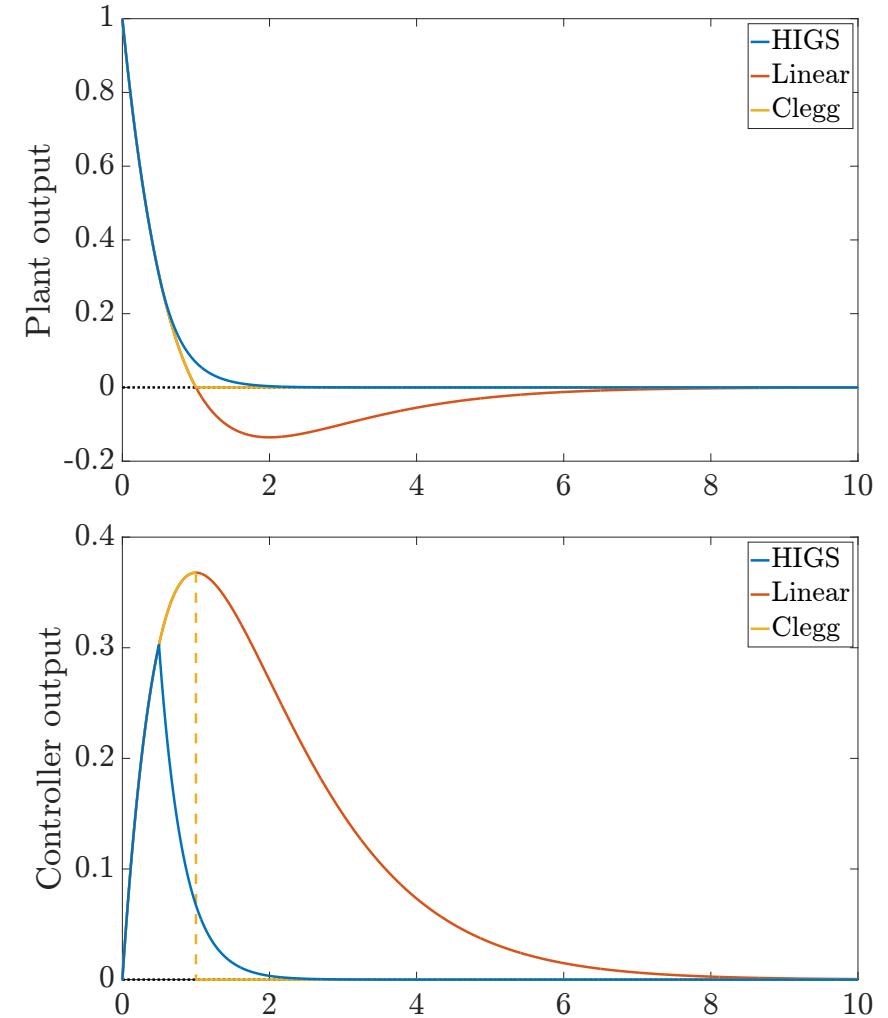
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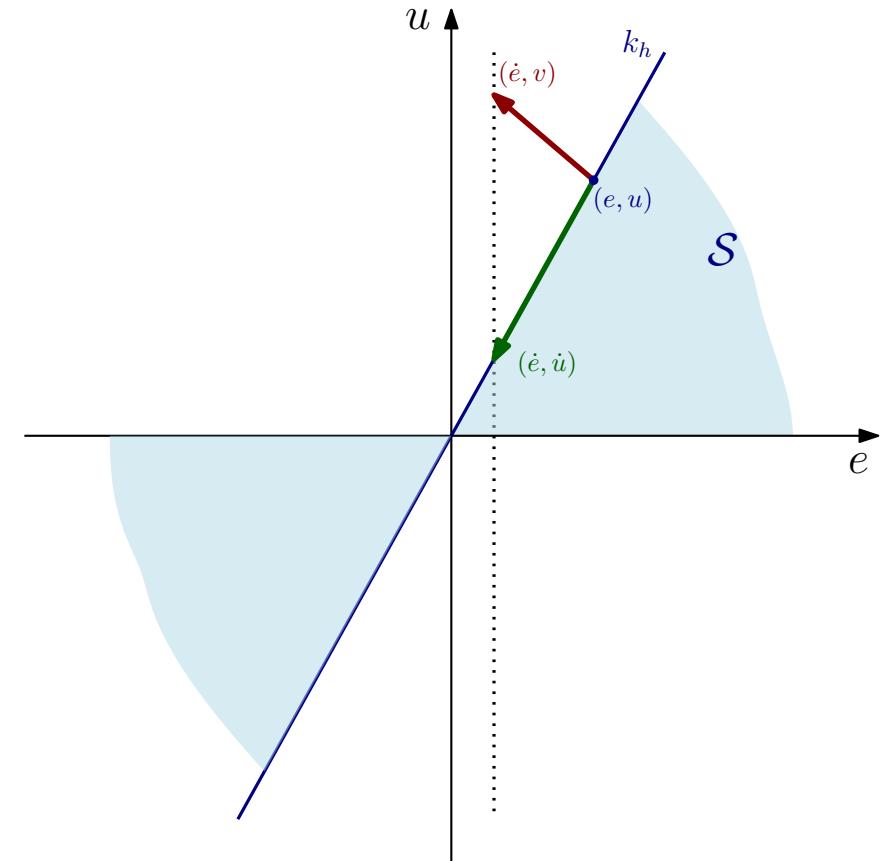


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We can extend this to any underlying dynamics

$$\dot{u} = \begin{cases} \textcolor{red}{v}, & (\textcolor{red}{v}, \dot{e}) \in T_S(u) \\ k_h \dot{e}, & (\textcolor{red}{v}, \dot{e}) \notin T_S(u) \end{cases}$$



A new approach: Projection-based control

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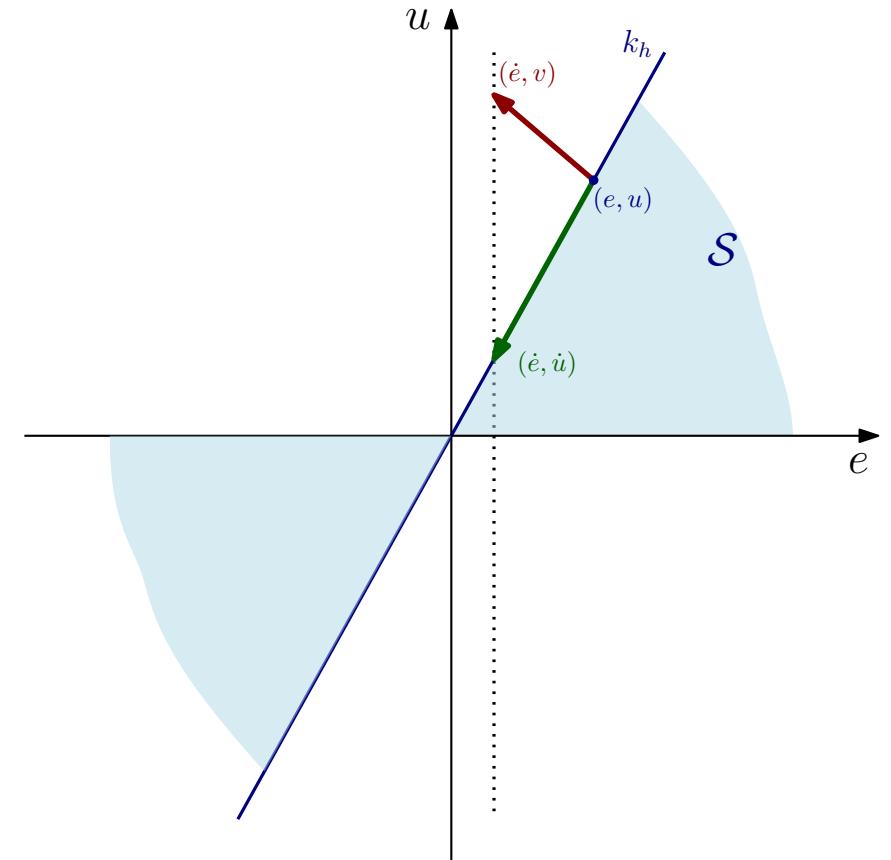


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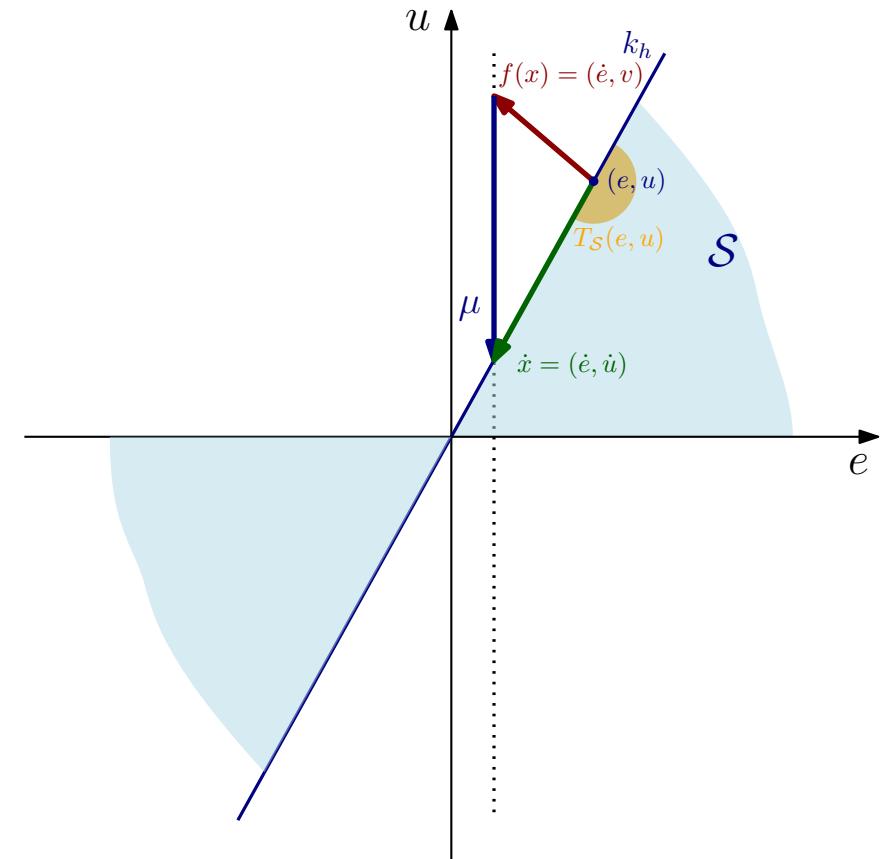
First-Order Projection Element (FOPE)

$$\dot{u} = \begin{cases} au + be, & (au + be, \dot{e}) \in T_S(u) \\ k_h \dot{e}, & (au + be, \dot{e}) \notin T_S(u) \end{cases}$$



Projection-based control: the ePDS framework

Since the error derivative cannot be modified, we can
project only in selected directions



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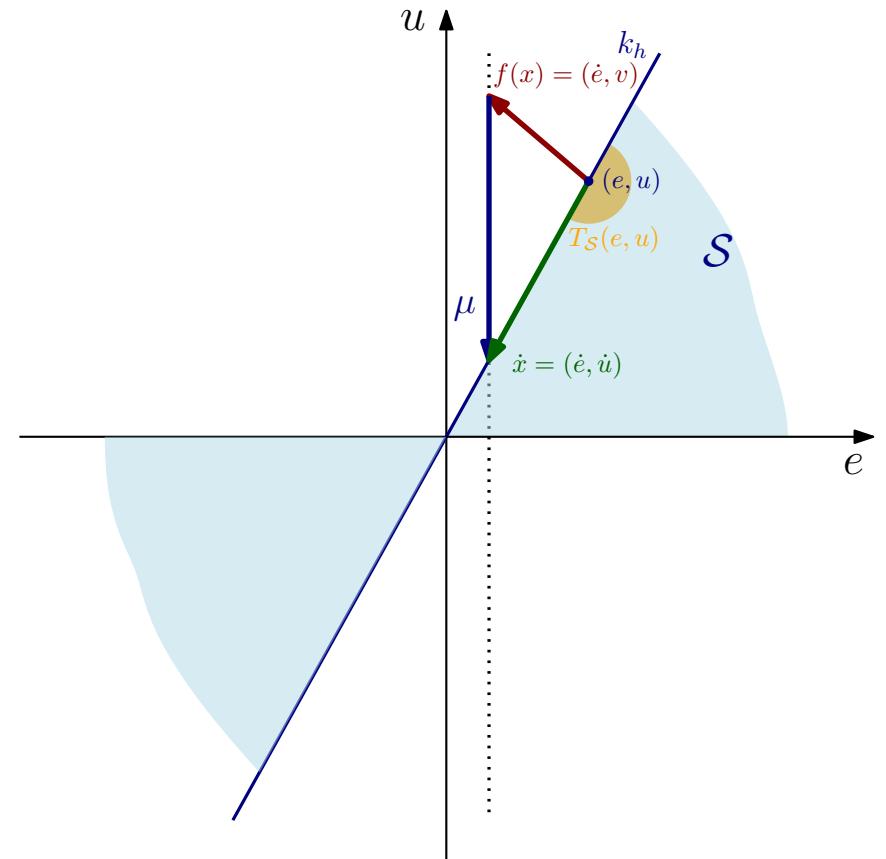


Extended Projected Dynamical Systems (ePDS)

$$\dot{x} = \Pi_{\mathcal{S}, E} f(x) = f(x) + \mu$$

where

$$\begin{aligned} \mu &:= \operatorname{argmin} \|w\| \\ \text{s.t. } f(x) + w &\in T_{\mathcal{S}}(x) \\ w &\in \operatorname{Im}(E) \end{aligned}$$



Projection-based control: the ePDS framework

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Extended Proj

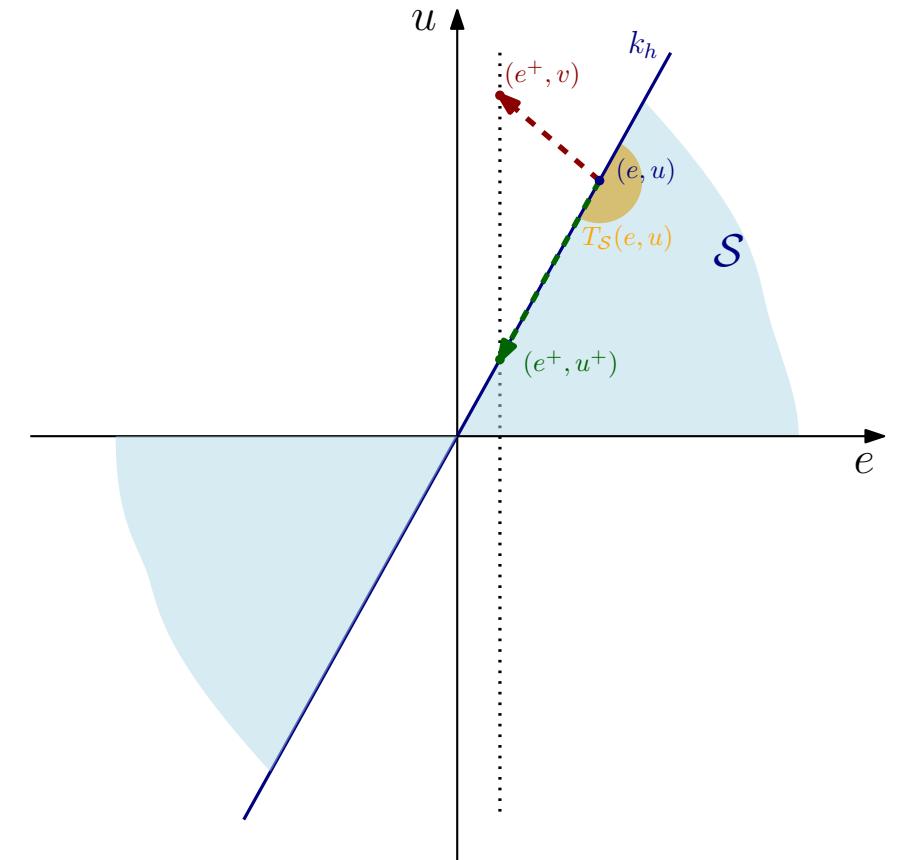
$$\dot{x} =$$

What happens in the discrete-time case?

where

$$\begin{aligned}\mu &:= \operatorname{argmin} \|w\| \\ \text{s.t. } f(x) + w &\in T_S(x) \\ w &\in \operatorname{Im}(E)\end{aligned}$$

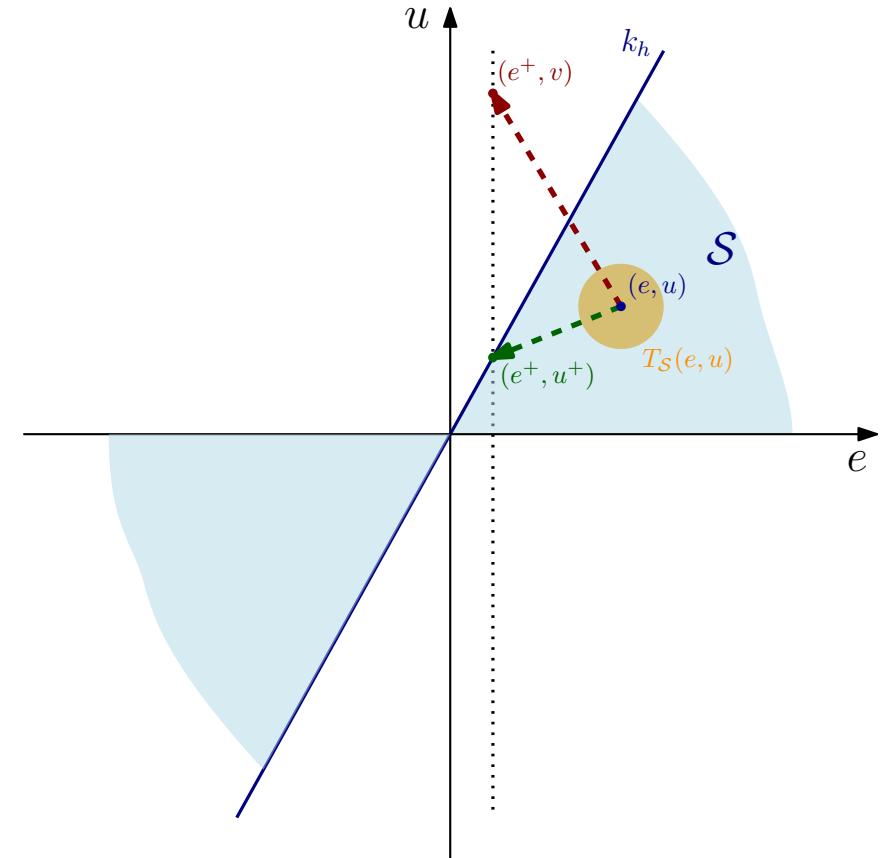
(DT) First-Order Projection Elements



(DT) First-Order Projection Elements

Possible issues:

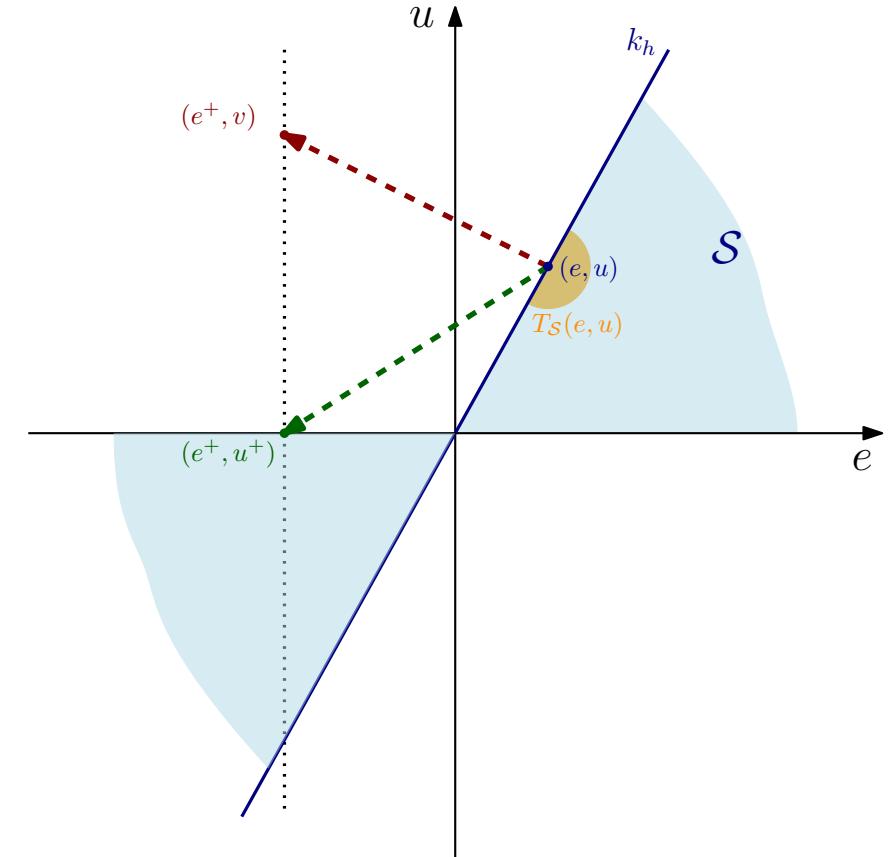
- **not necessarily from the boundary of the set**



(DT) First-Order Projection Elements

Possible issues:

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 - e can **change sign**



(DT) First-Order Projection Elements

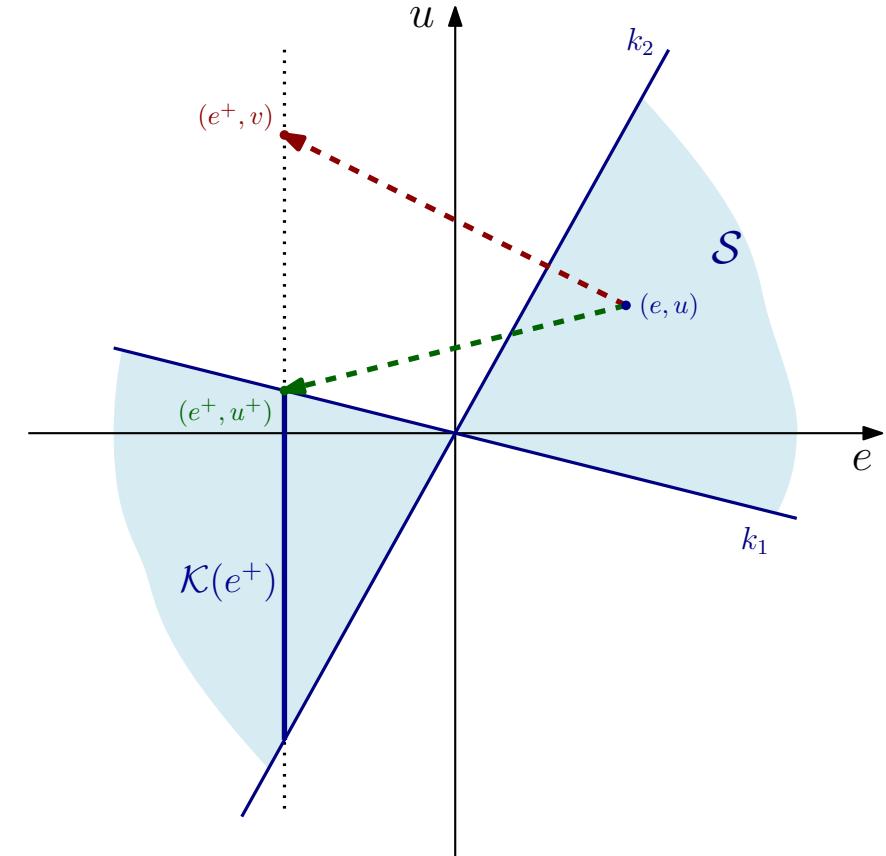
Possible issues:

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First-Order Projection Element: projection on an **input-dependent set**

$$\mathbf{u}^+ = \Pi_{K(e^+)}(\mathbf{v}) = \Pi_{K(e^+)}(a\mathbf{u} + b\mathbf{e}^+)$$

(where $|a| \leq 1, b > 0$)



(DT) First-Order Projection Elements

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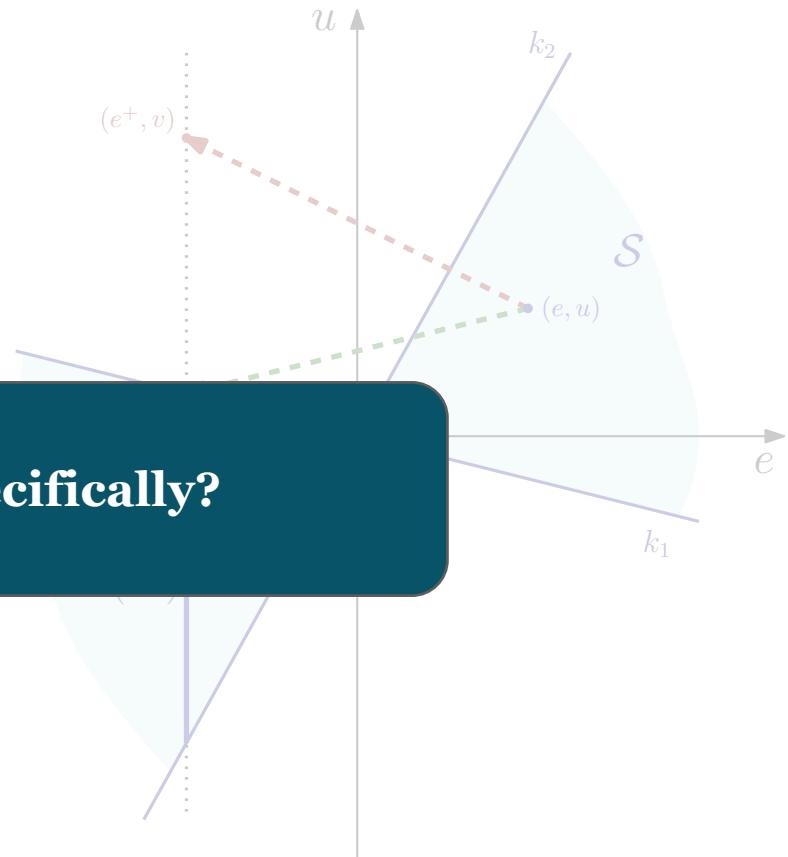
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 - e can change sign

What are we investigating specifically?

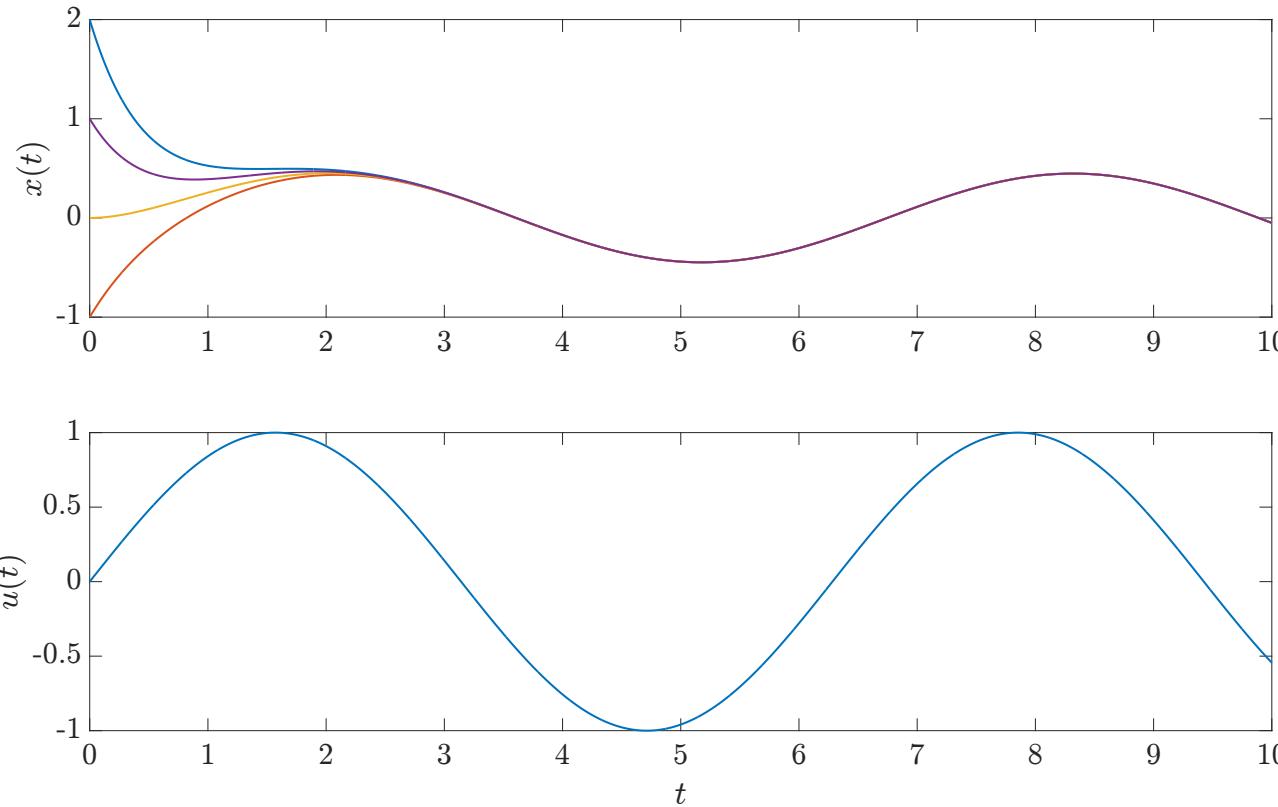
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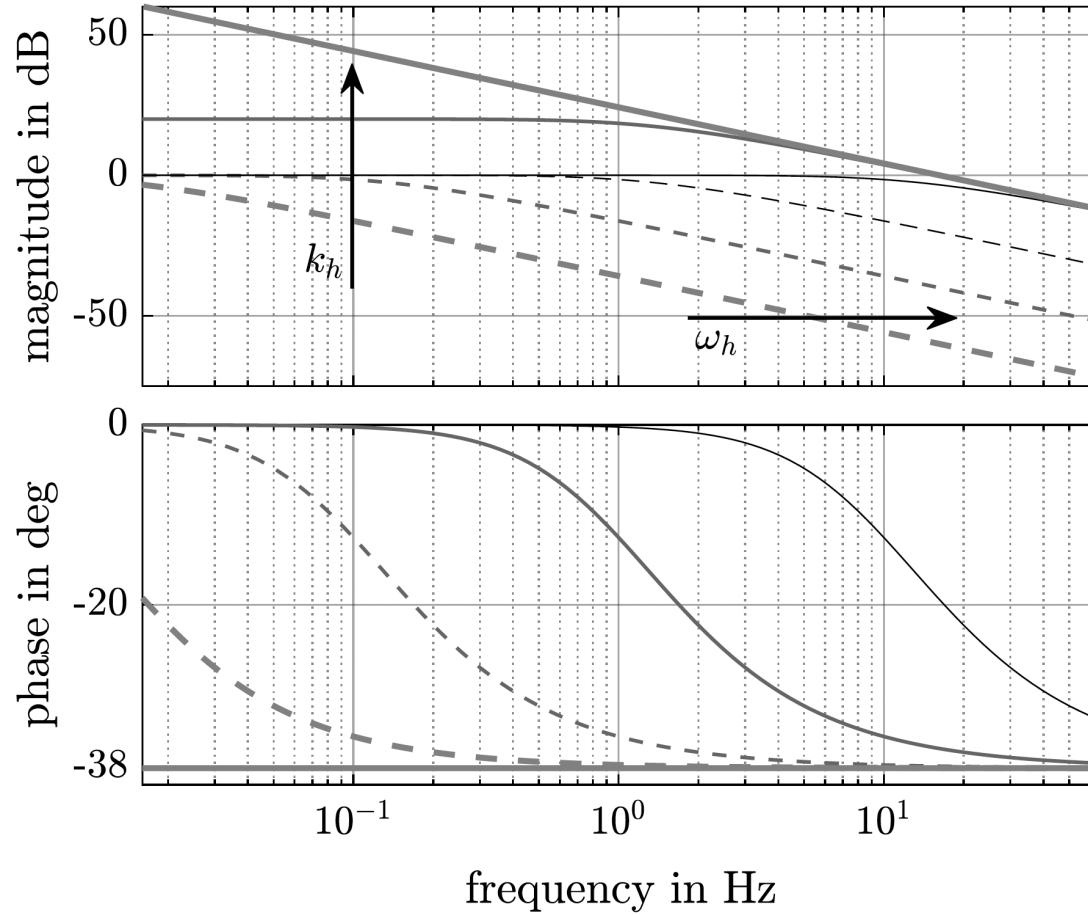
Research question: Discrete-time Incremental Stability



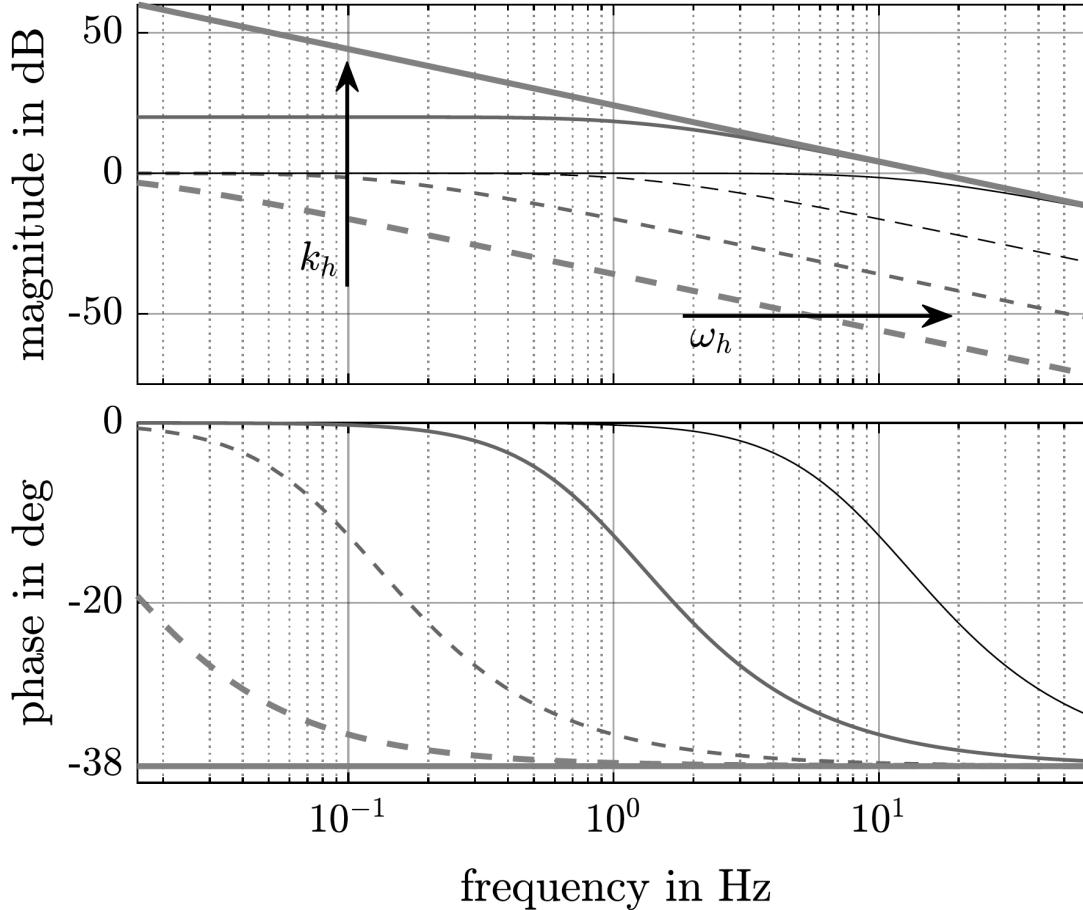
DEFINITION: Incremental (asymptotic/exponential) stability

If two copies of the system are subject to the **same input**, their **trajectories converge to each other** (asymptotically/exponentially)

Literature overview

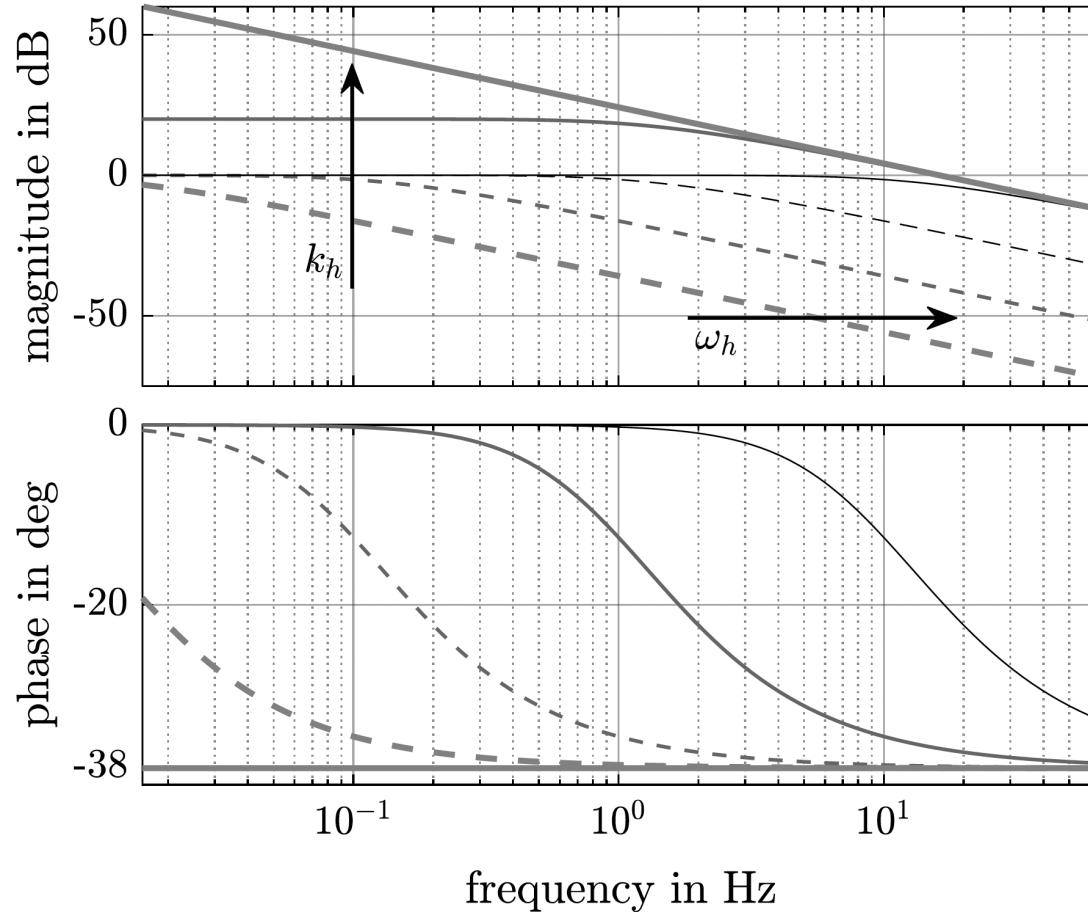


Literature overview



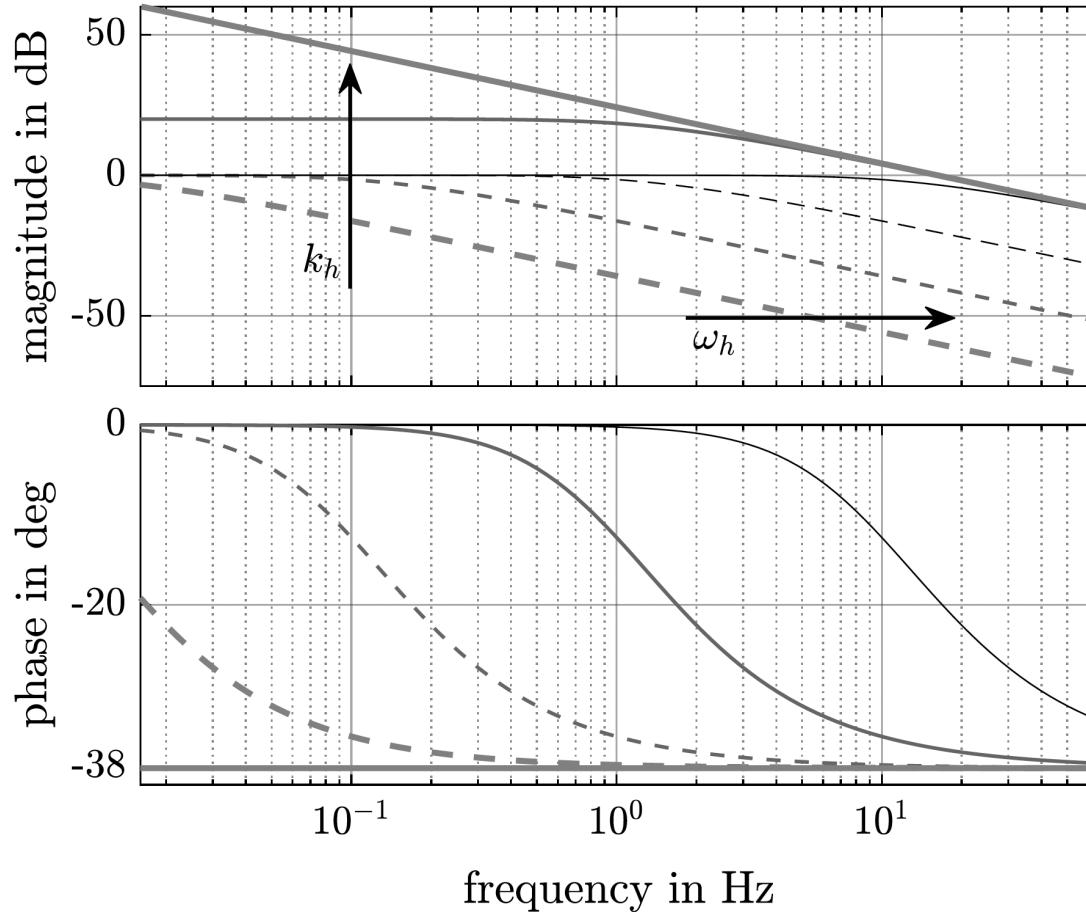
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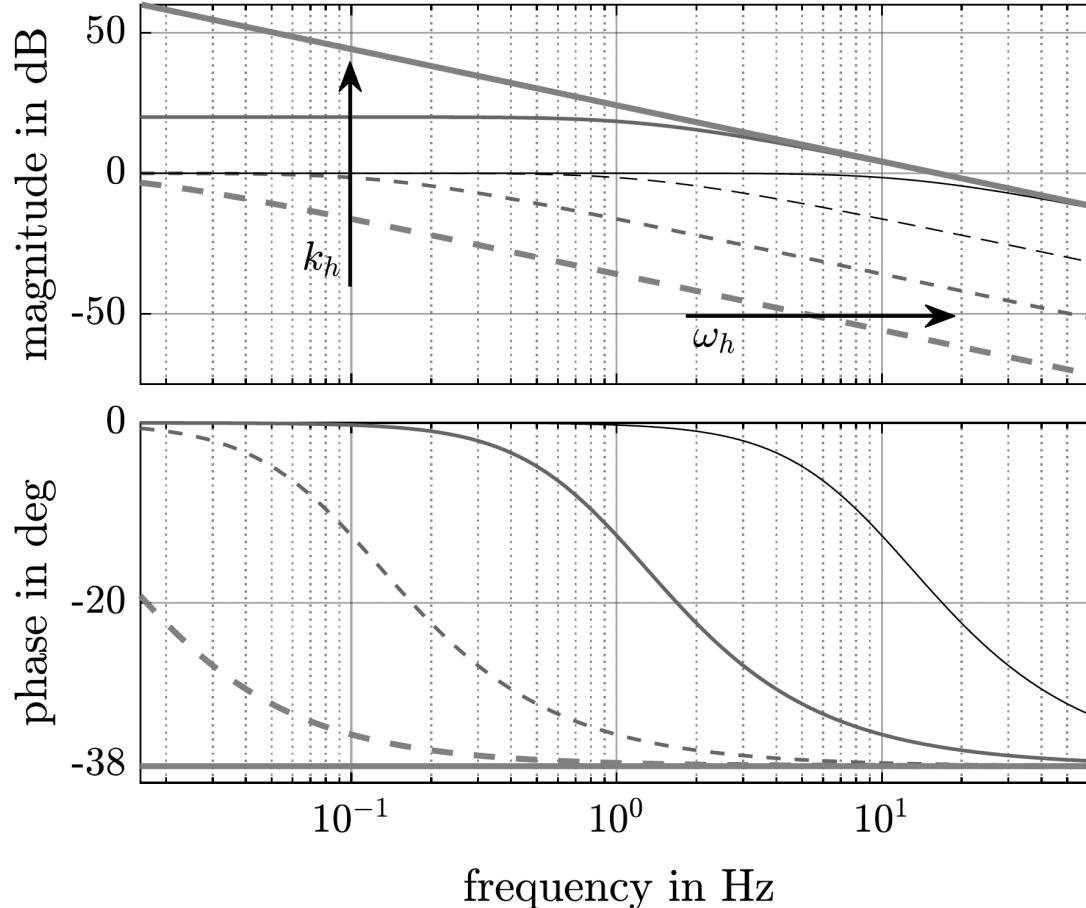
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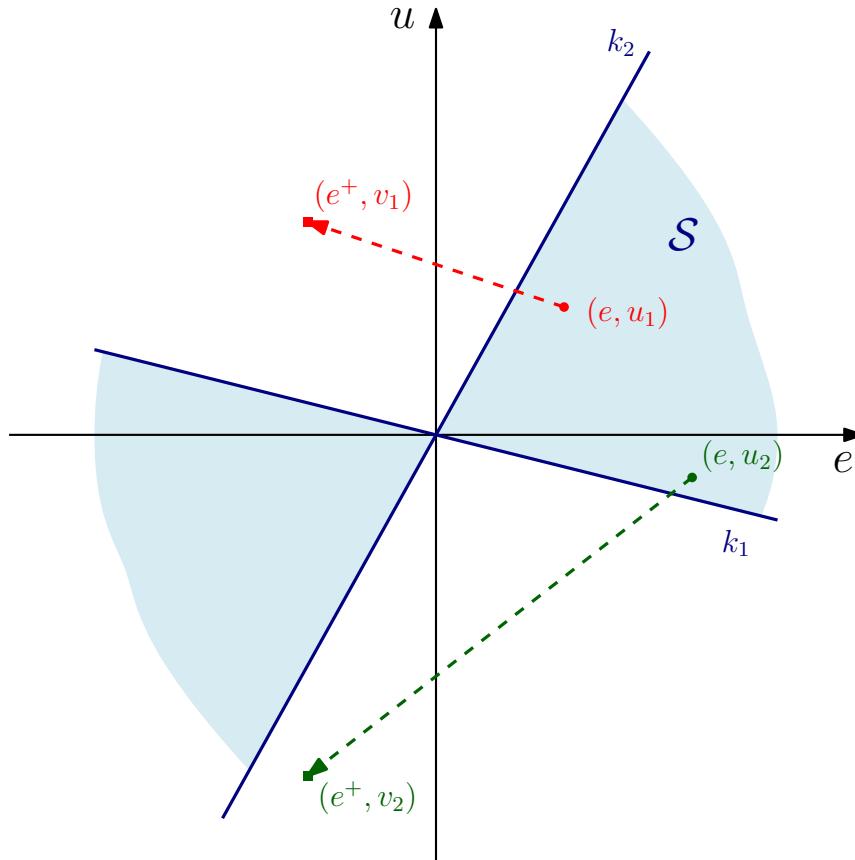
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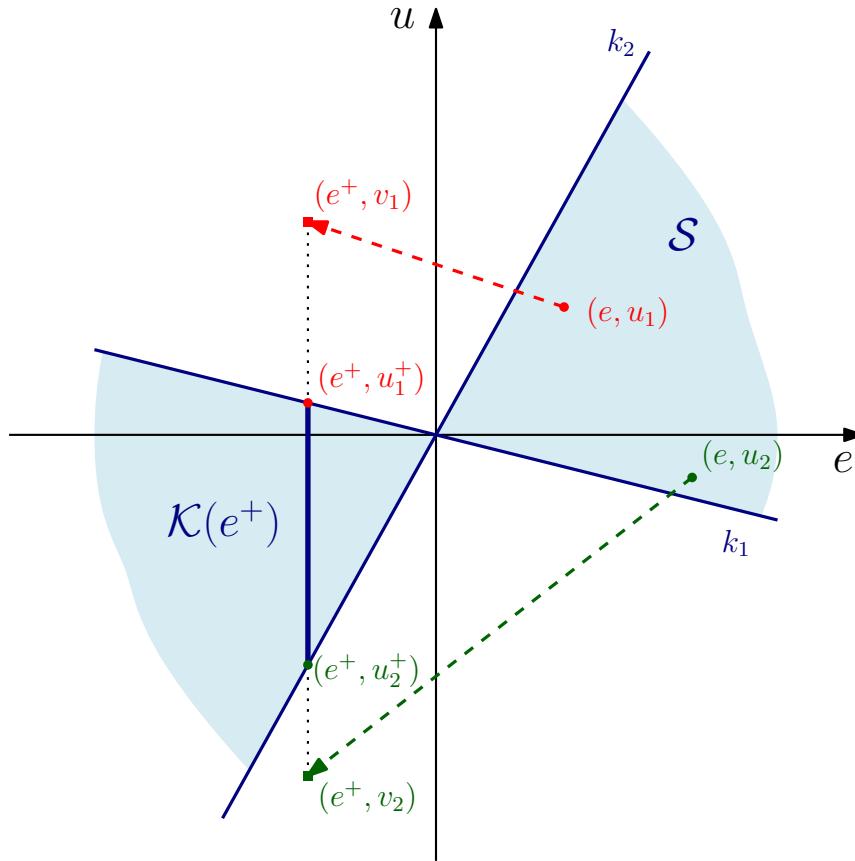


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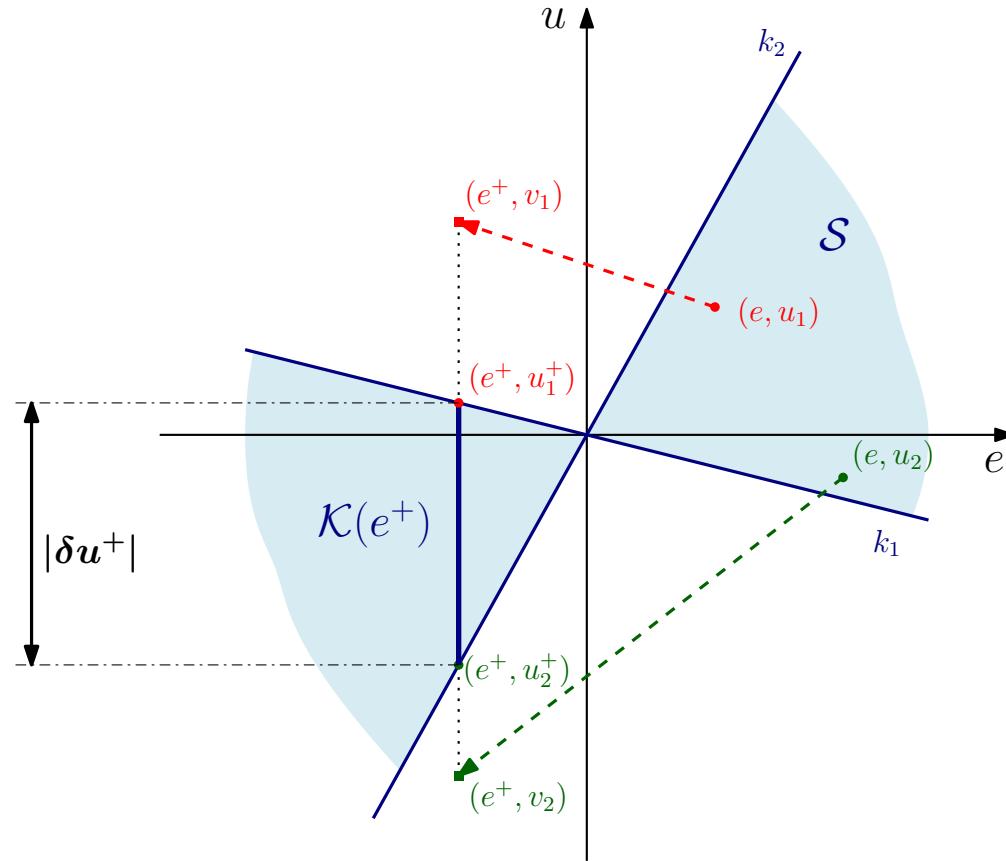
Open-loop Incremental Stability



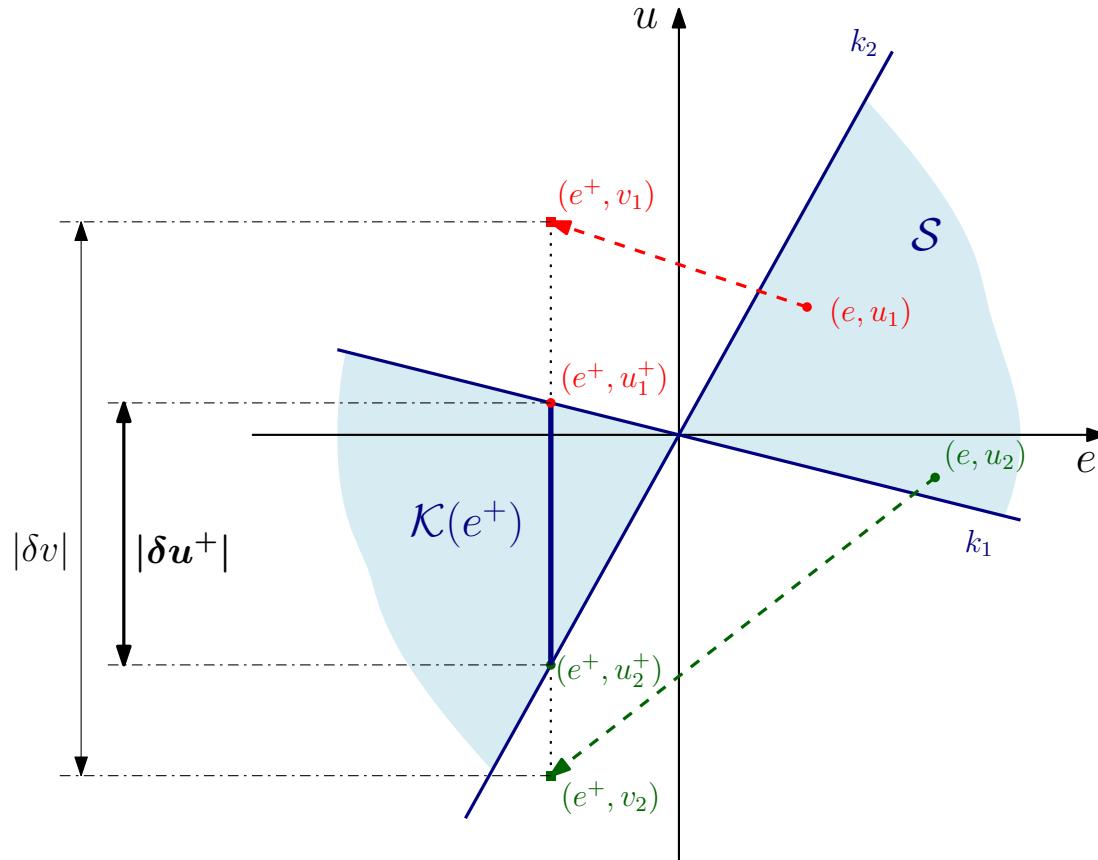
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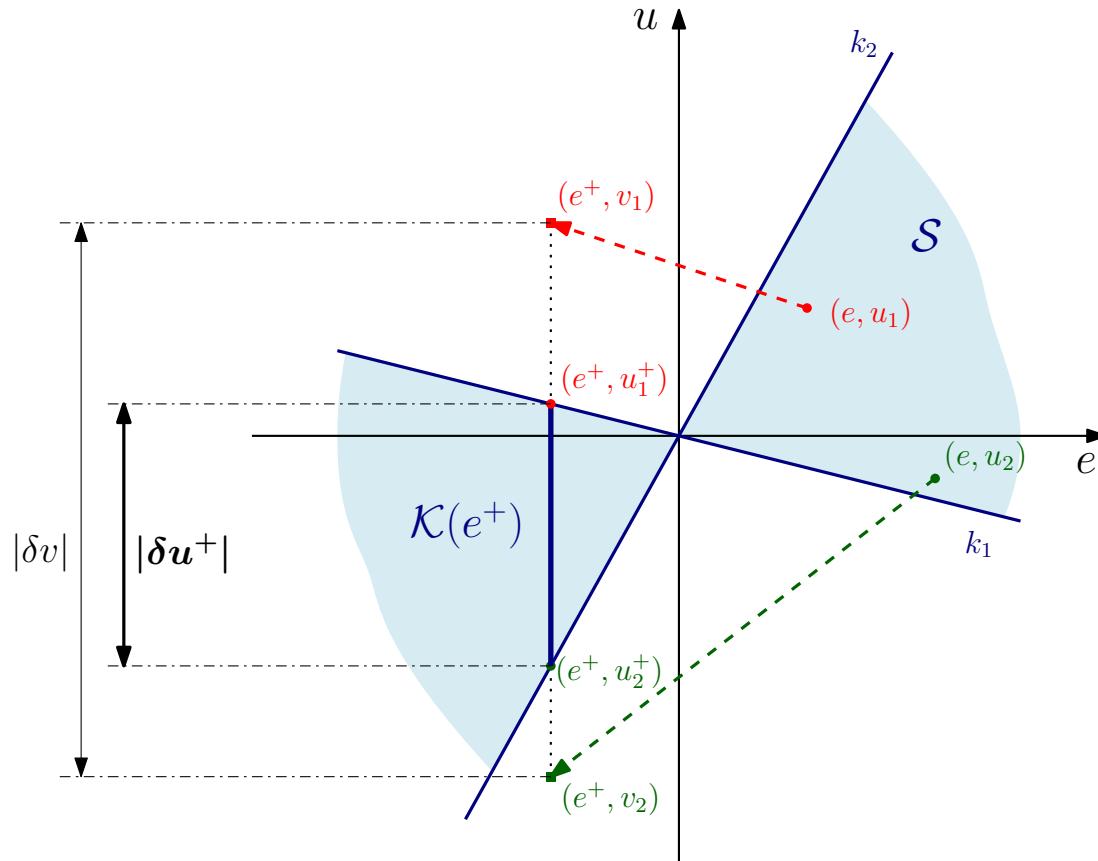
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Open-loop Incremental Stability



LEMMA 1:

The projection on the same set $K(e)$ is **non-expansive**

Open-loop Incremental Stability: GES underlying dynamics

The case $|a| < 1$ is **straightforward**:

Open-loop Incremental Stability: GES underlying dynamics

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$$|\delta u^+| \leq |\delta v|$$

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$$\leq |au_1 + be^+ - au_2 - be^+|$$

Open-loop Incremental Stability: GES underlying dynamics

The case $|a| < 1$ is **straightforward**:

$$\begin{aligned} |\delta u^+| &\leq |\delta v| \\ &\leq |au_1 + be^+ - au_2 - be^+| \\ &= |a||\delta u| \end{aligned}$$

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THEOREM 1:

If the underlying dynamics is GES (Globally Exponentially Stable), the FOPE is **incrementally exponentially stable**

Open-loop Incremental Stability: GES underlying dynamics

The case $|a| < 1$ is **straightforward**:

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$$= |a||\delta u|$$

If $a=1$, this is not enough!

THEOREM 1:

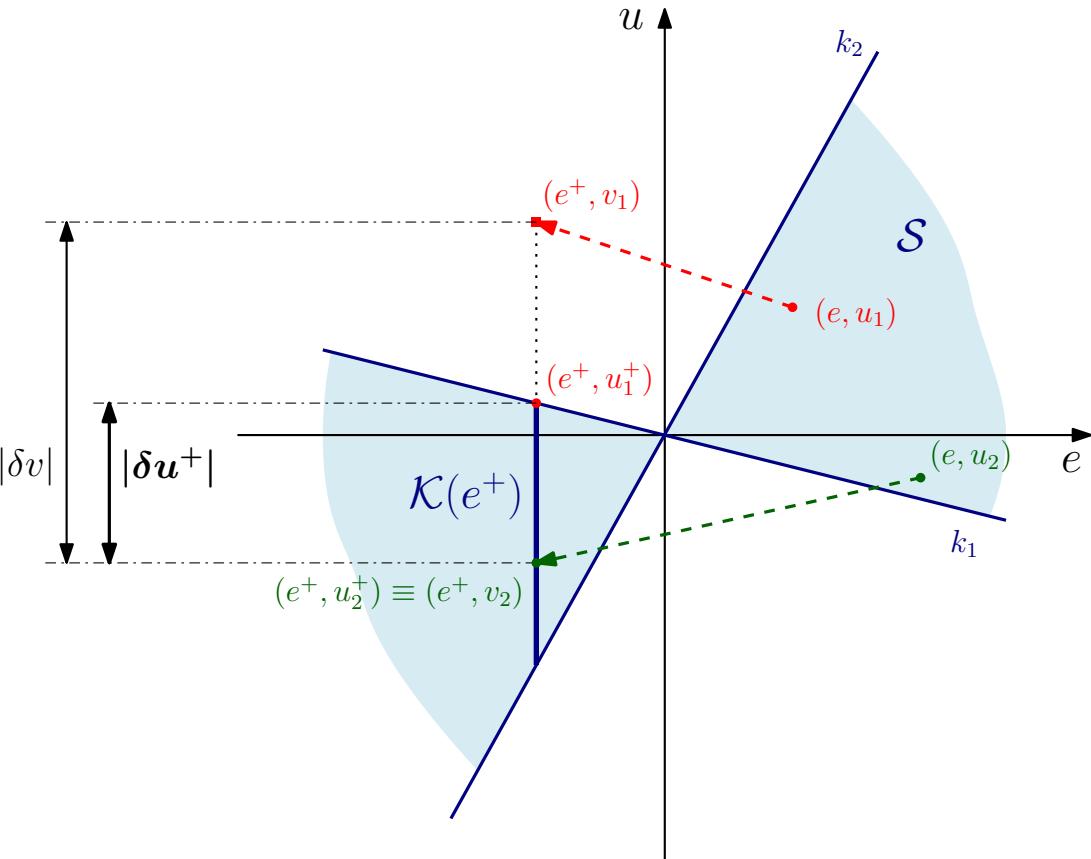
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Open-loop Incremental Stability: Integrator case

- **Integrator** dynamics is **not incrementally stable**

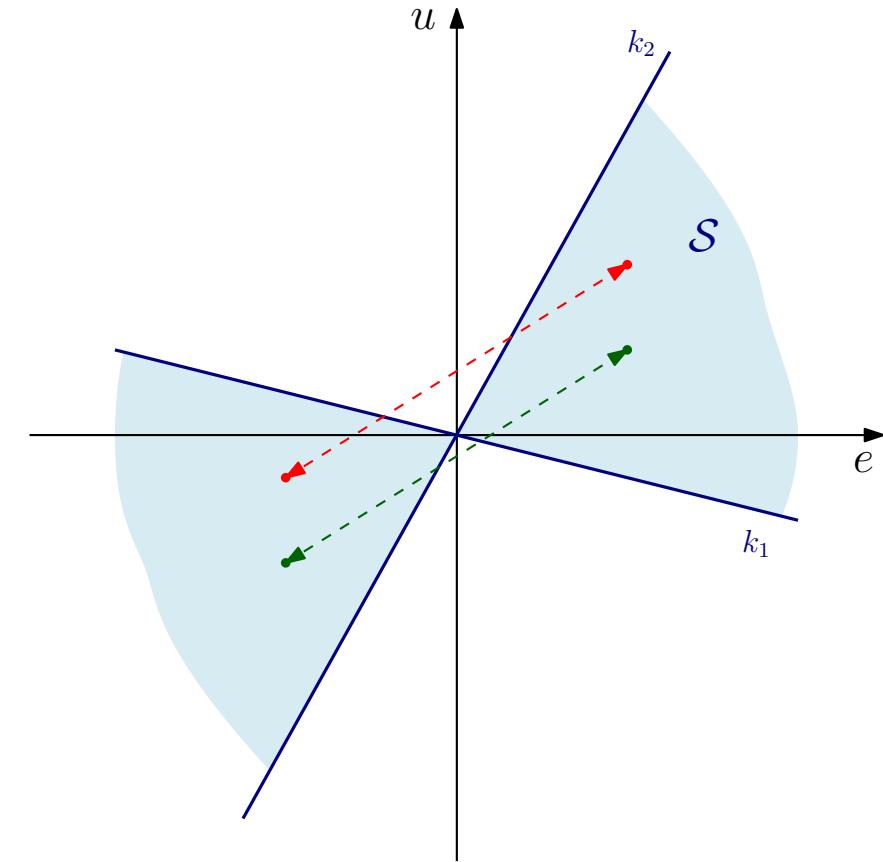
Open-loop Incremental Stability: Integrator case

- **Integrator dynamics is not incrementally stable**
- **When the projection is active** for (at least) one of the two trajectories, the **inequality** $|\delta u^+| < |\delta v|$ is **strict**



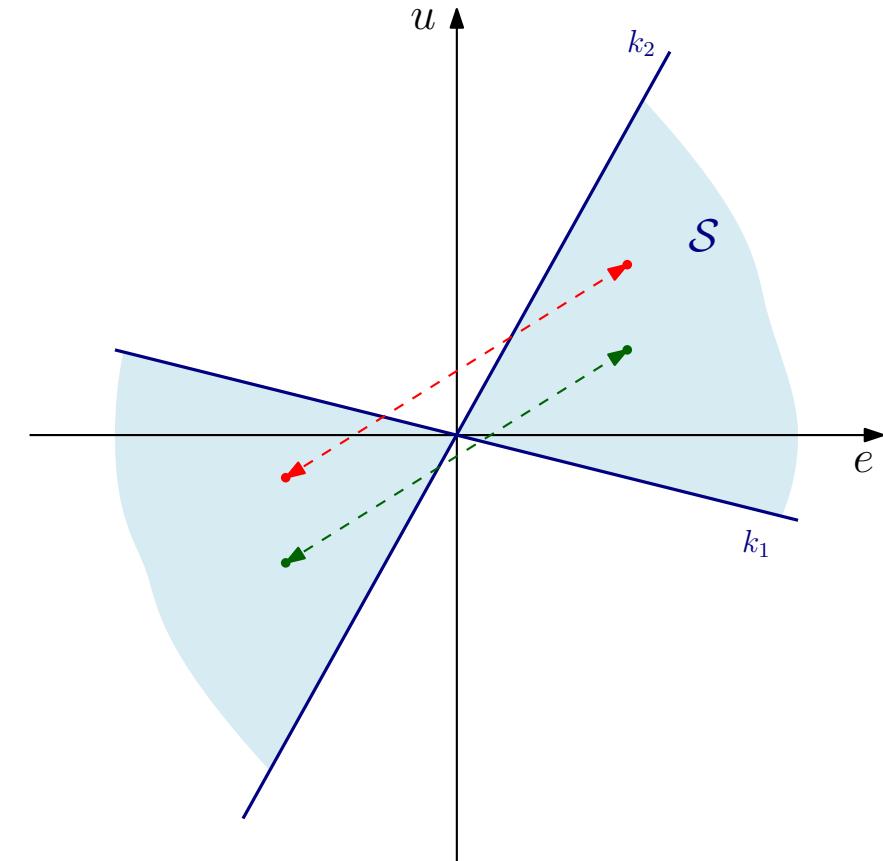
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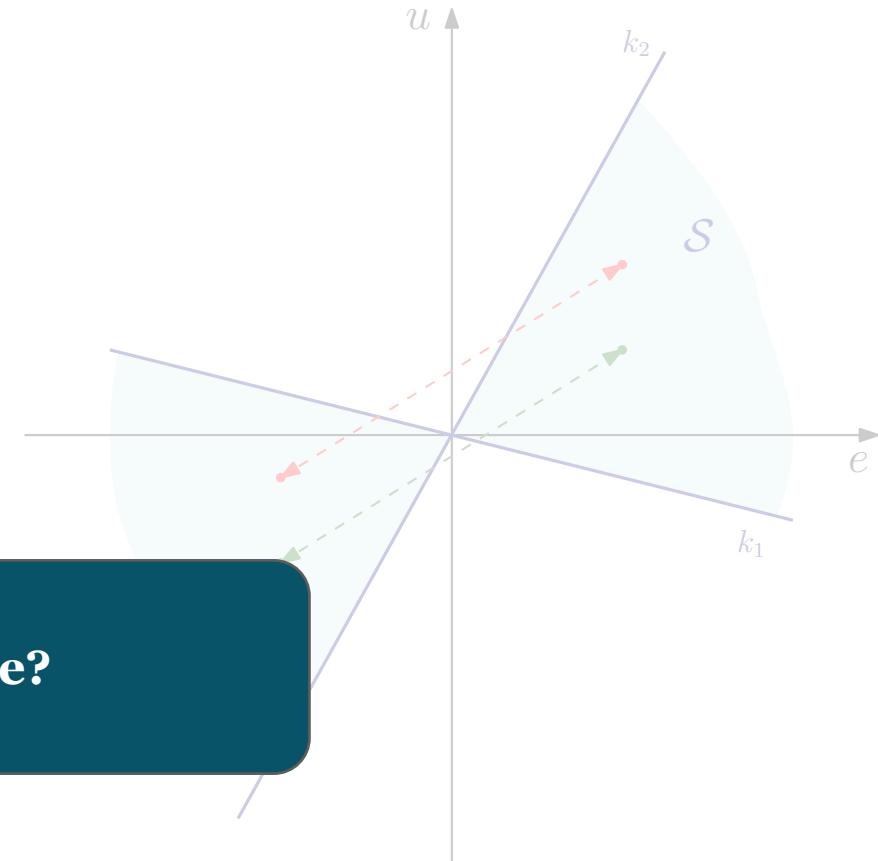
If $a=1$, then the FOPE is **incrementally asymptotically stable if and only if** the parameter $b>0$ satisfies

$$b \notin (2k_1, 2k_2)$$

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What if the inputs are not the same?

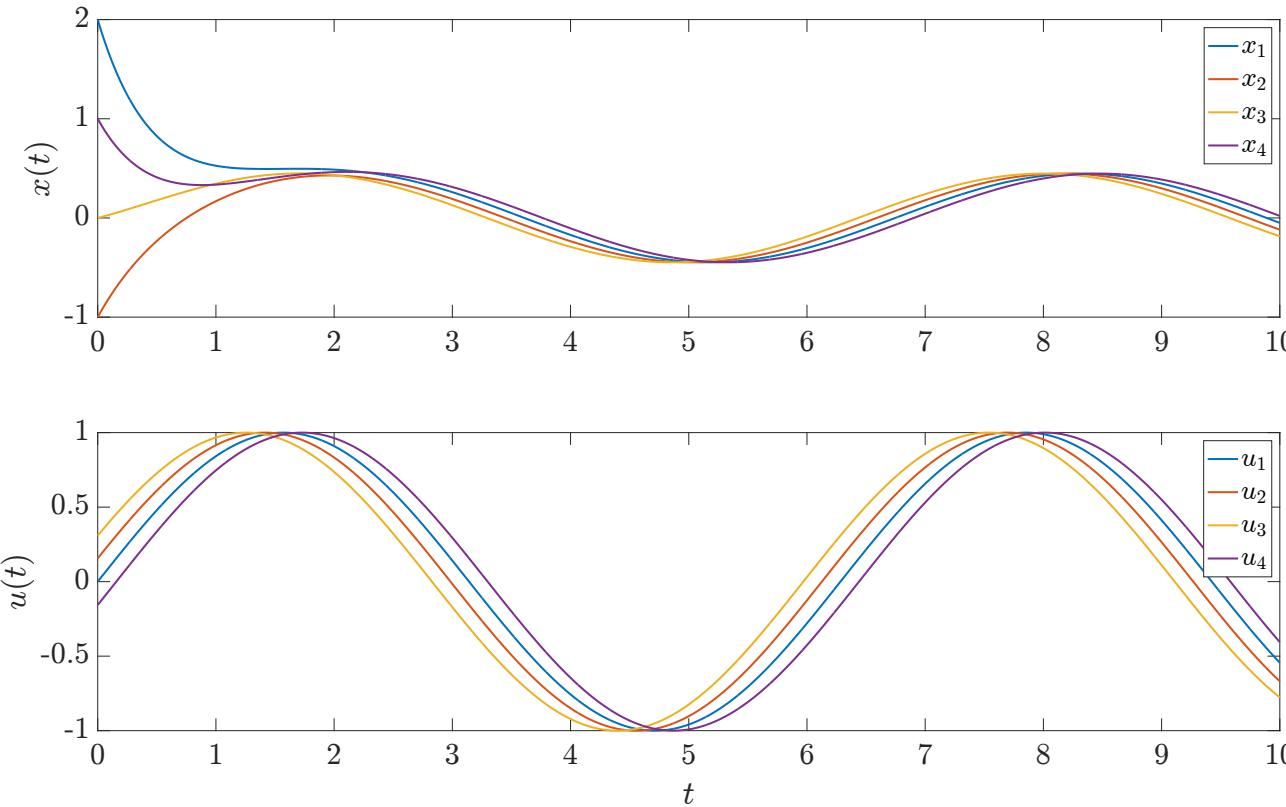


THEOREM 2:

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$$b \notin (2k_1, 2k_2)$$

Research question: DT Incremental ISS



DEFINITION: Incremental input-to-state stability (ISS)

If two copies of the system are subject to **different inputs**, the **bound on the distance between their trajectories** converges to some positive value **related to the distance between the inputs**

Open-loop Incremental ISS

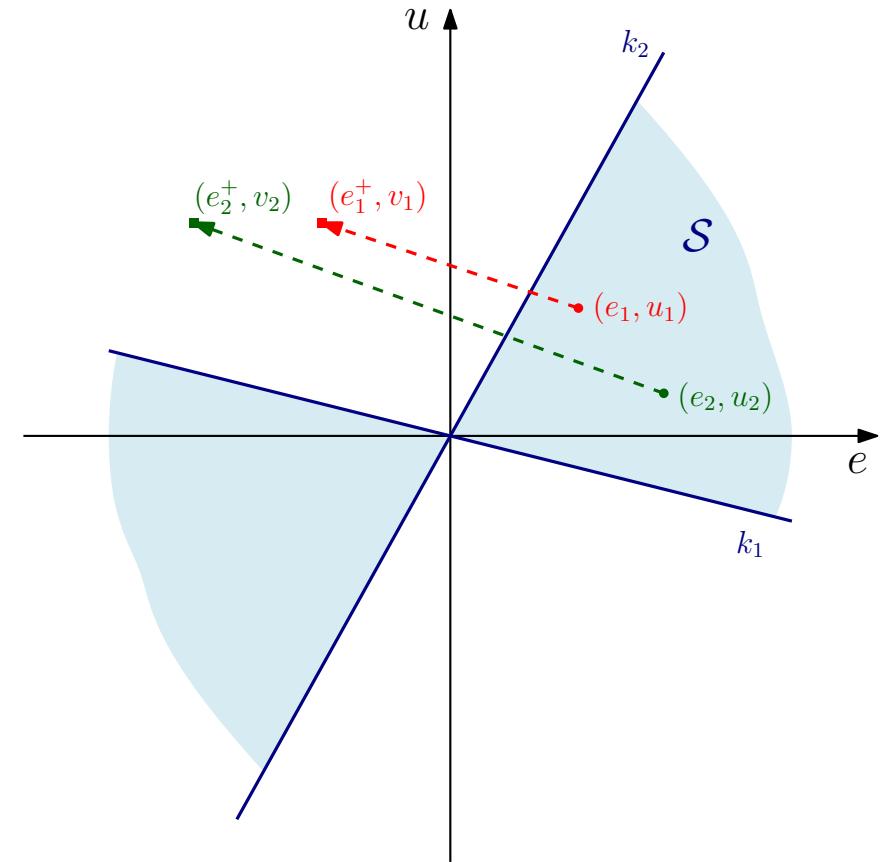
- What happens if two copies of a FOPE are subject to two **different error signals**?

Open-loop Incremental ISS

- What happens if two copies of a FOPE are subject to two **different error signals**?
- In general, this might **increase the distance** between u_1 and u_2

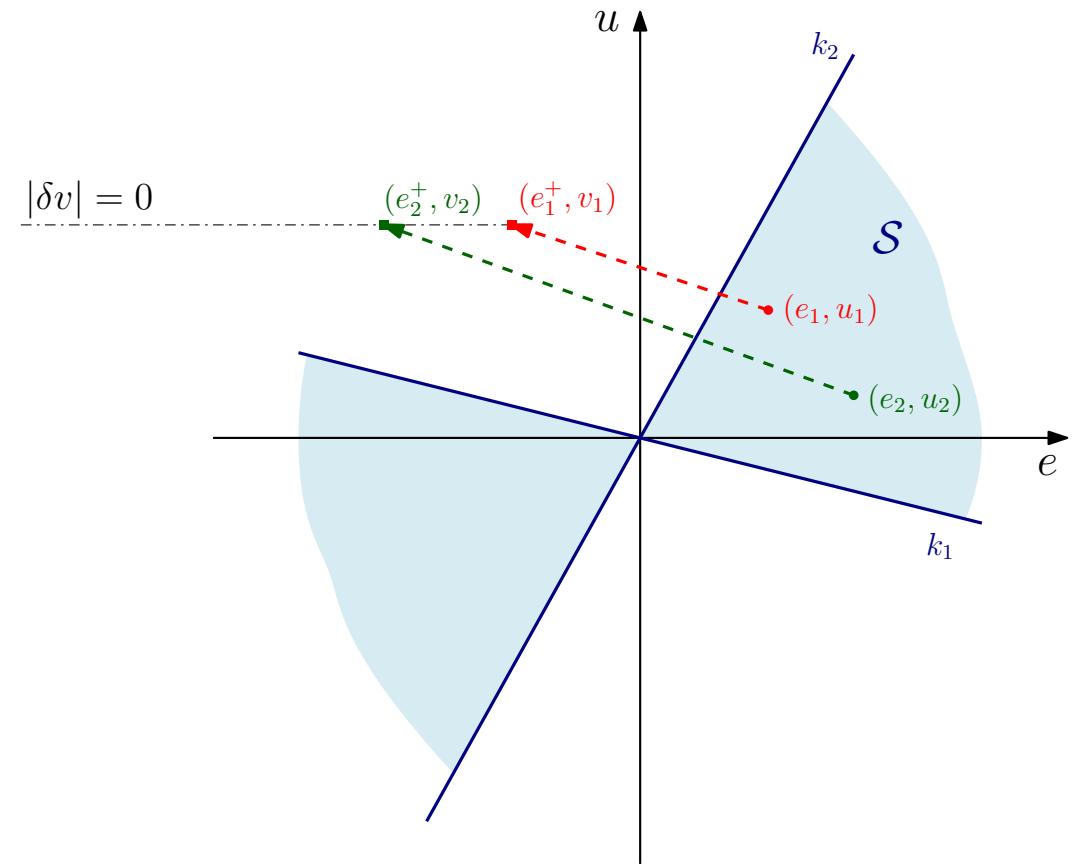
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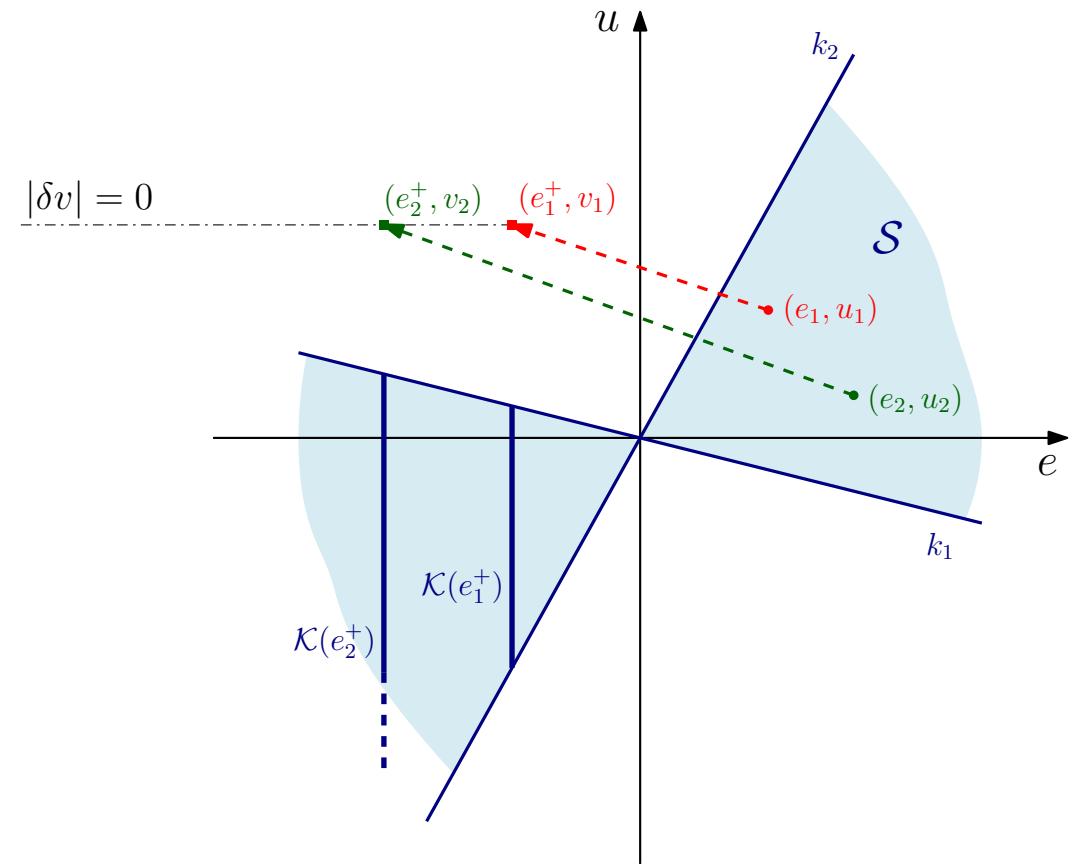
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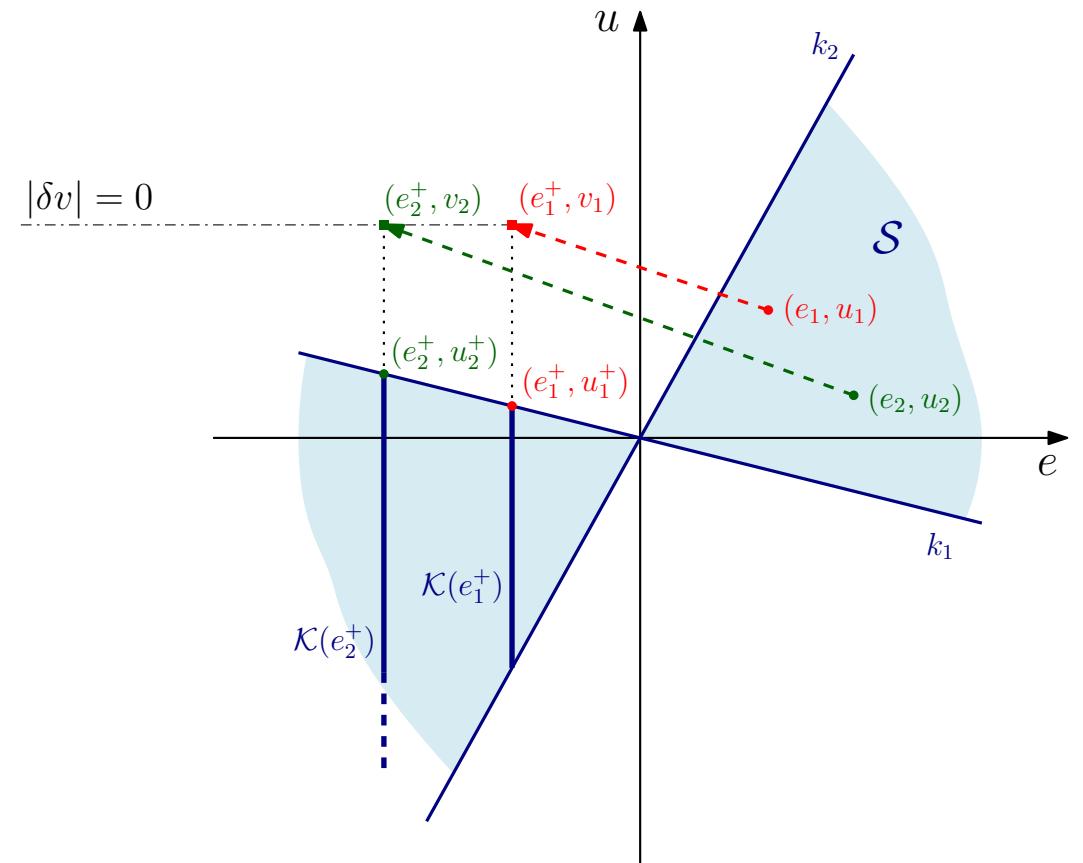
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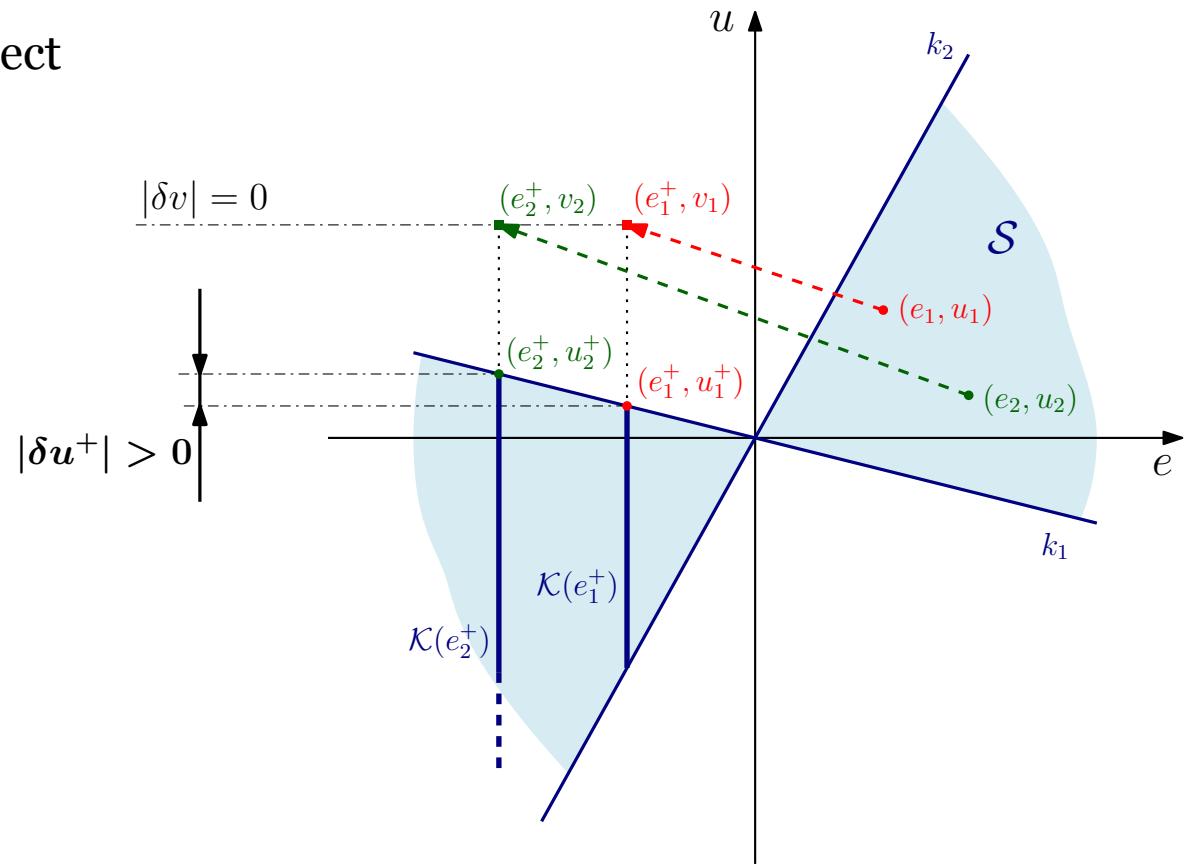
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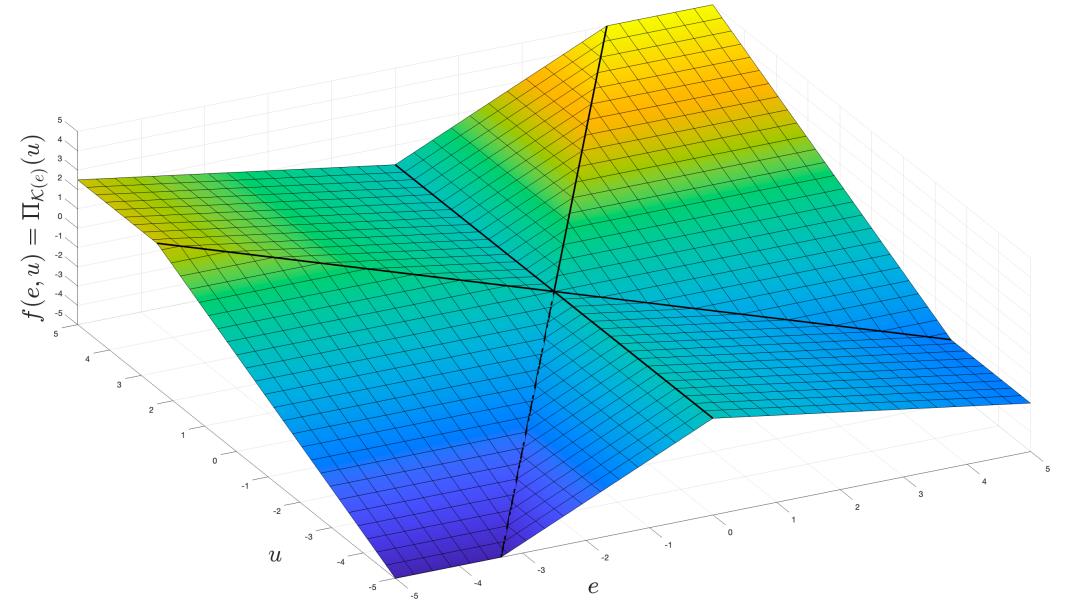
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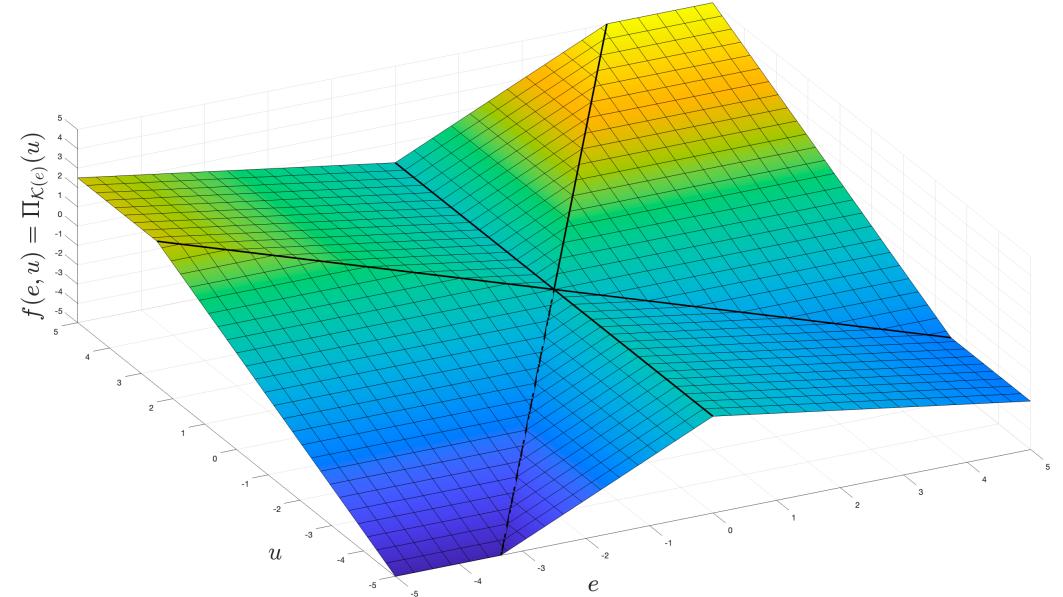
Open-loop Incremental ISS

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- In general, this might **increase the distance** between u_1 and u_2
- However, the projection (written as a 2D map) is **Lipschitz continuous**, with constant $\bar{k} = \max\{|k_1|, |k_2|\}$



Open-loop Incremental ISS

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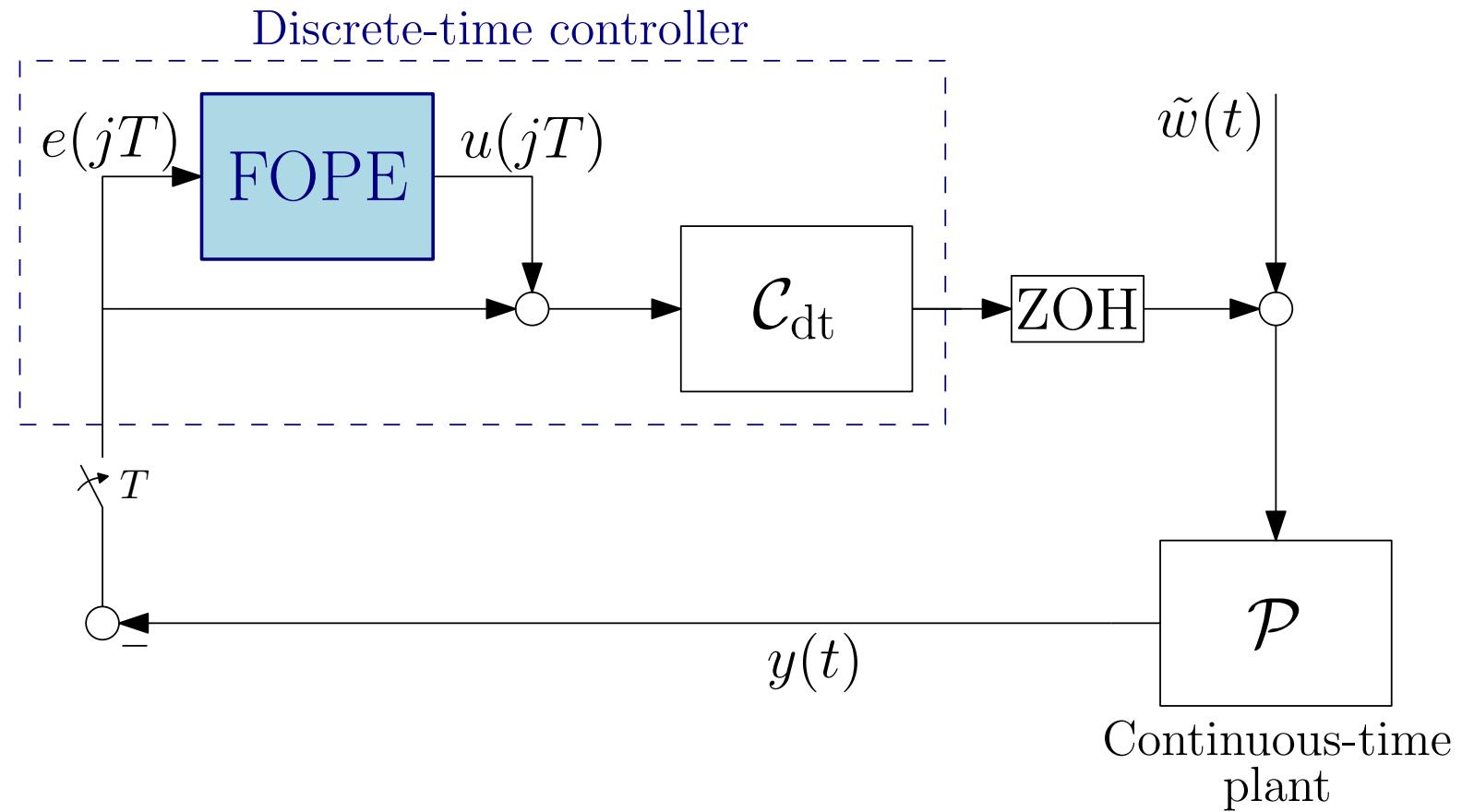
LEMMA 2:

If the underlying dynamics is GES (i.e., $|a| < 1$), then

$$|\delta u^+| \leq |a| |\delta u| + (b + \bar{k}) |\delta e^+|$$

And the FOPE is **incrementally exponentially input-to-state stable**

Research question: Closed-loop Incremental ISS



Closed-loop incremental ISS: Incremental small gain theorem

We can use the following result

THEOREM⁽¹⁾:

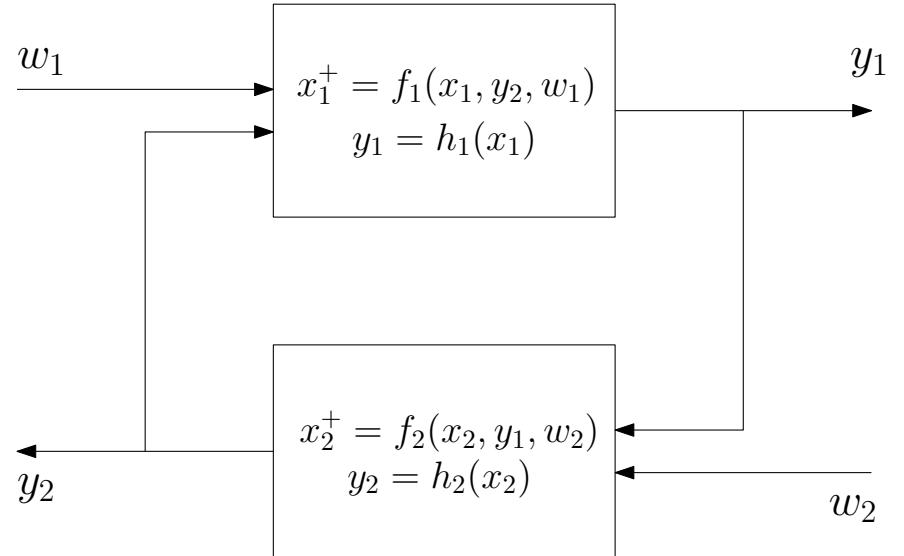
When two DT systems are interconnected in feedback as shown, if the following hold

$$|y_1(j)| \leq \beta_1(j, |x_1(0)|) + \gamma_{y,1} \|y_2\|_\infty + \gamma_{w,1} \|w_1\|_\infty$$

$$|y_2(j)| \leq \beta_2(j, |x_2(0)|) + \gamma_{y,2} \|y_1\|_\infty + \gamma_{w,2} \|w_2\|_\infty$$

$$\gamma_{y,1} \cdot \gamma_{y,2} < 1$$

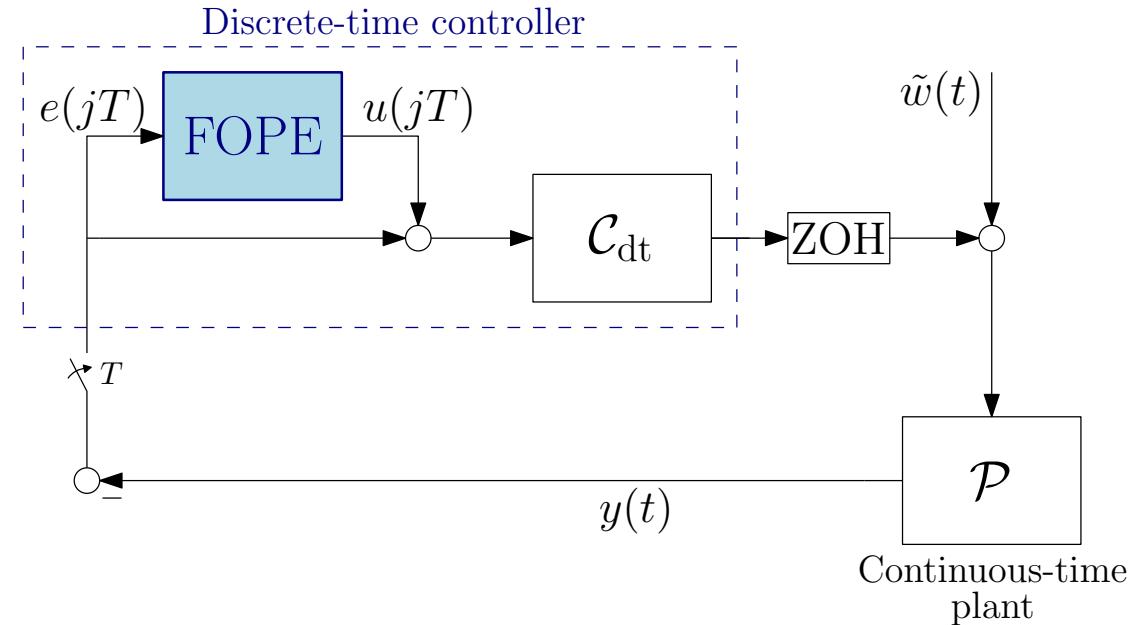
then the **closed-loop dynamics is ISS**.



⁽¹⁾ Z.P. Jiang, A.R. Teel, L. Praly (1994). Small-gain theorem for ISS systems and applications. *Mathematics of Control, Signals and Systems*.

Consequences of incremental ISS: Incremental small gain theorem

We can easily write an **incremental version** and apply it to the **sampled-data interconnection** of the discrete-time FOPE and a continuous-time linear plant



THEOREM 3:

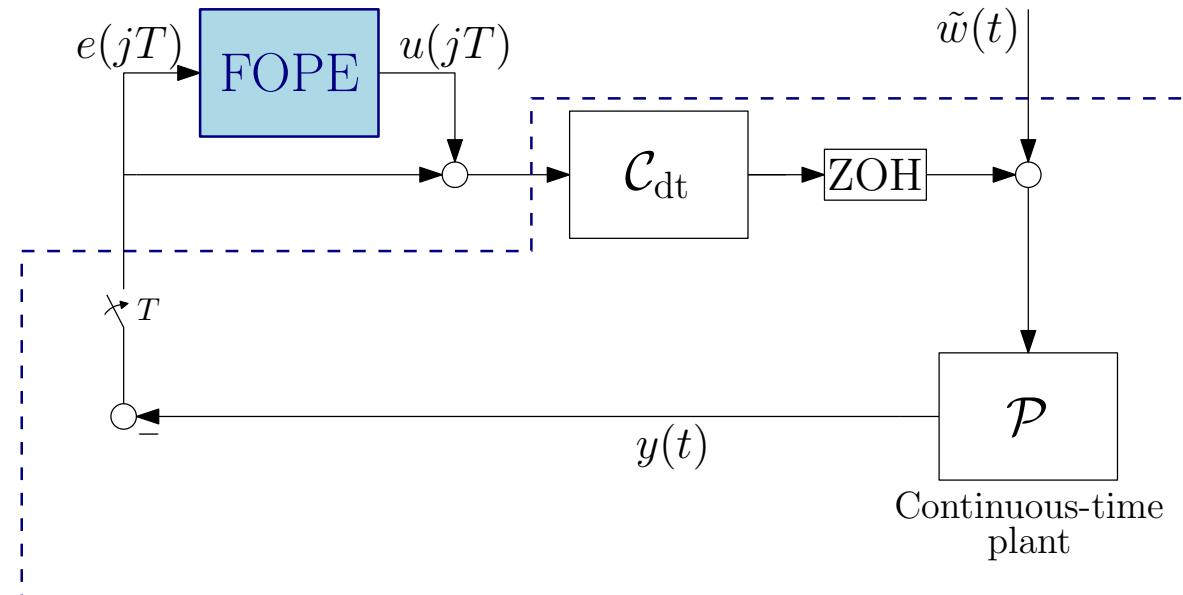
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$$\frac{b + \bar{k}}{1 - |a|} < \frac{1}{||P_{dt}||_{\ell_1}}$$

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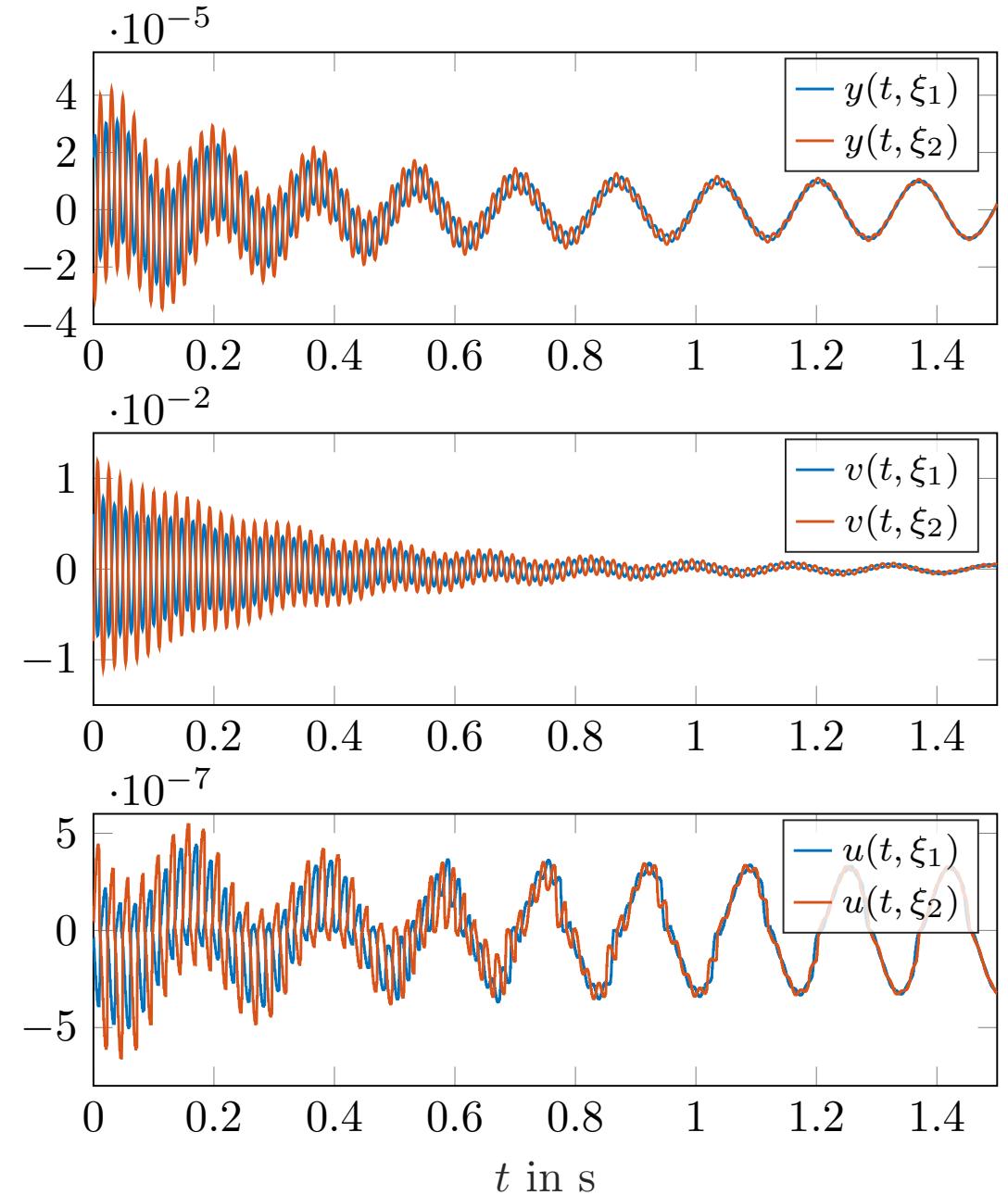
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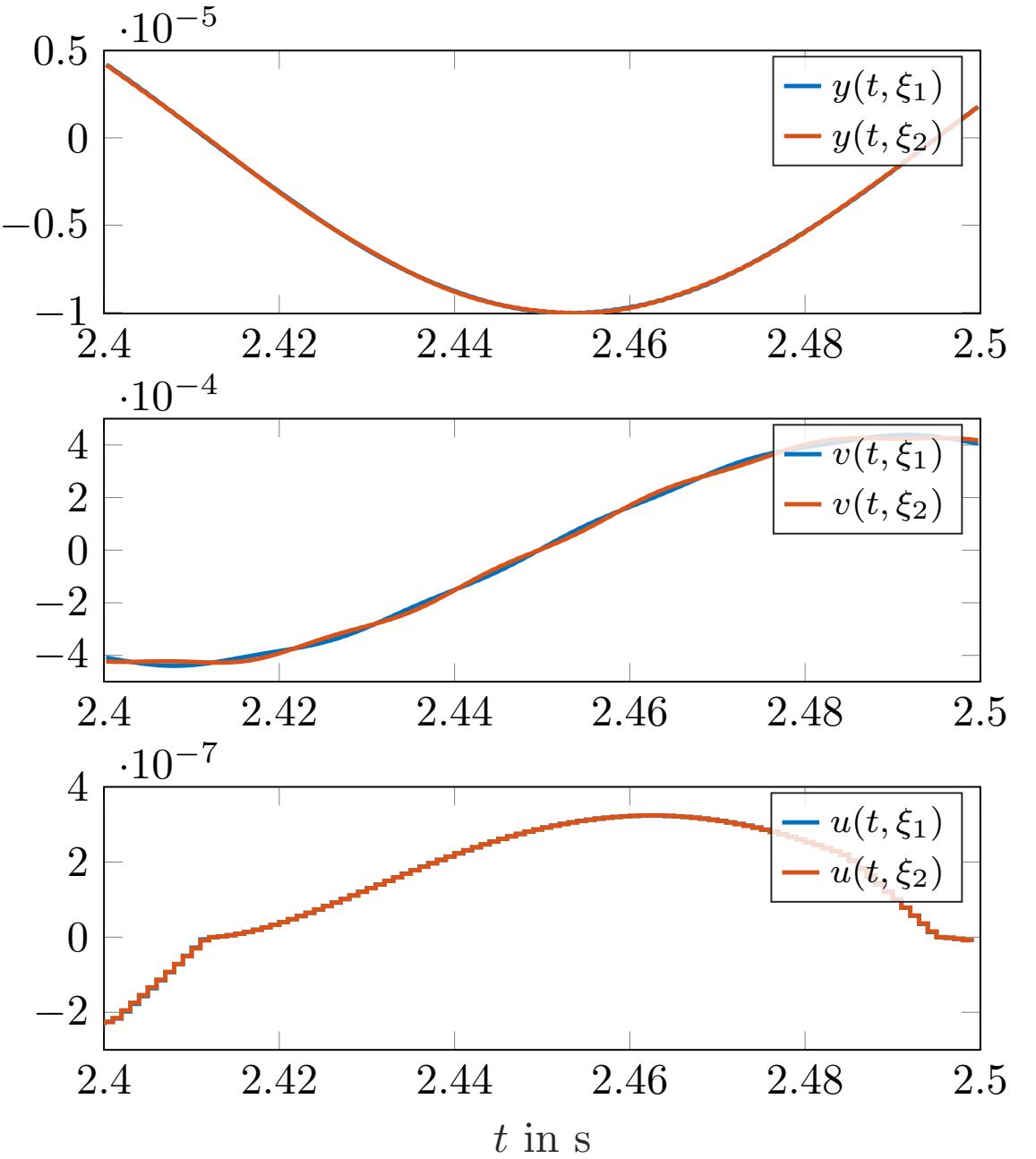
RESULTS:

- The states of the closed loop converge to the same trajectory
- The trajectories have the **same frequency as the input signal**



Simulations

Close-up on the previous plots, to highlight the sampled-data nature of the feedback loop



Conclusion

- We analyzed the dynamics of the **discrete-time FOPE**, a control element obtained by projecting a first order dynamics onto a sector
- We showed necessary and sufficient conditions for **incremental stability in open-loop** and sufficient conditions for **incremental ISS in closed loop**

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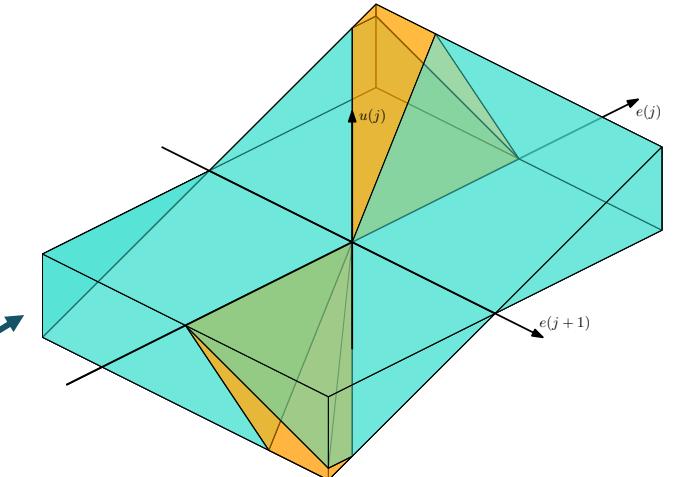
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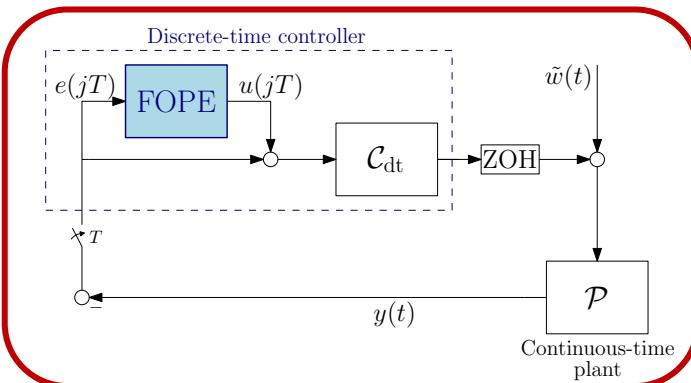
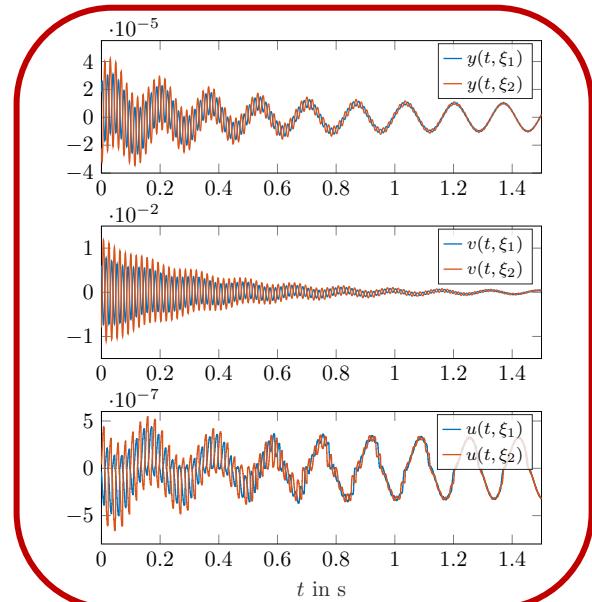
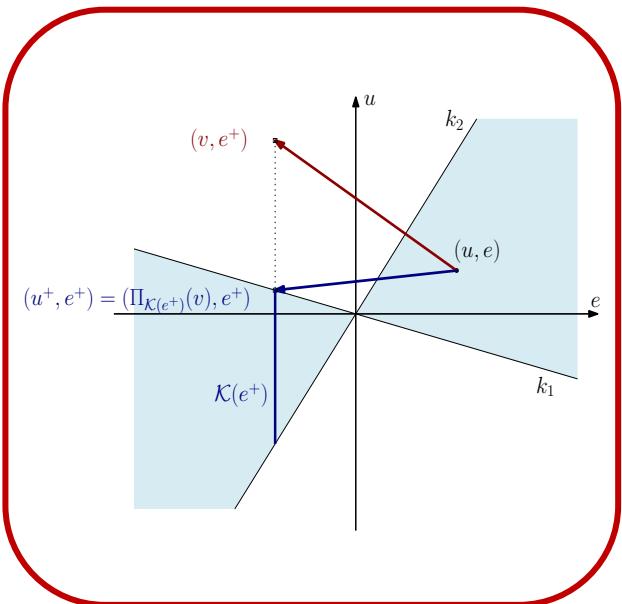
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- Formally prove **convergence properties** (all the ingredients are there, but we need to be careful about some details)
- Prove **incremental ISS** of the closed loop through **less conservative conditions**
- The condition for incremental stability with $a=1$ are quite conservative: is there a **better formulation?**





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