



New Directions
in Hybrid
Systems Theory

Aaron D. Ames

Outline

Softwalls

Computing
Reachability
Sets

A Categorical
Theory of
Hybrid Systems

Conclusion

New Directions in Hybrid Systems Theory

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Chess Review, November 18, 2004



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- 1** Softwalls
 - J. Adam Cataldo
 - Prof. Edward Lee
- 2** Computing Reachability Sets
 - Alex Kurzhanskiy
 - Prof. Pravin Varaiya
- 3** A Categorical Theory of Hybrid Systems
 - Aaron D. Ames
 - Prof. Shankar Sastry





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Soft Walls Example: Problem statement

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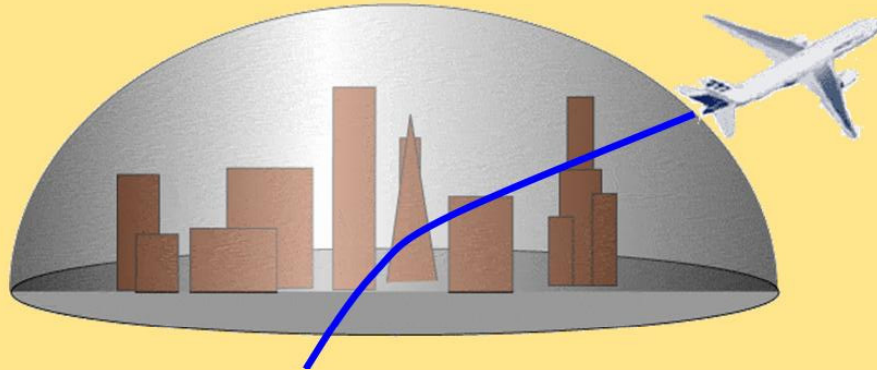
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- Enforce no-fly zones using on-board avionics.
- A collision occurs if the aircraft enters a no-fly zone.



Soft Walls: Control Strategy

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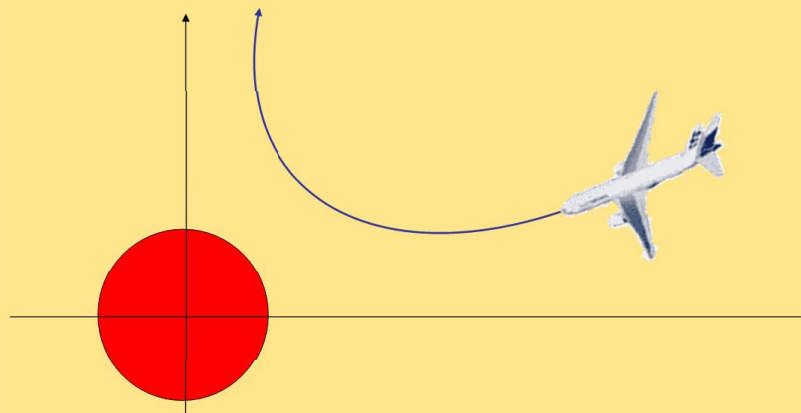
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Conclusion

- An "optimal" control strategy would push the aircraft away from the no-fly zone while minimizing interference.
- This can lead to chattering between the left and right bias if the pilot fights with the control system—the result is Zeno behavior.





Soft Walls: Control Strategy

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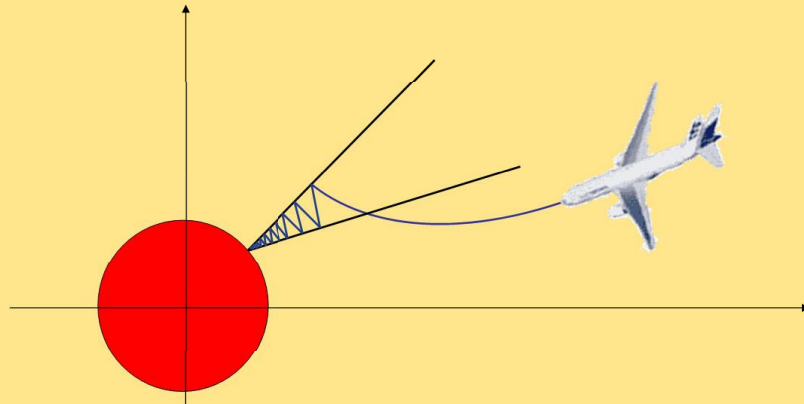
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Conclusion

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- This can lead to chattering between the left and right bias if the pilot fights with the control system—the result is Zeno behavior.



Soft Walls Example: Adding States to Remove Chatter

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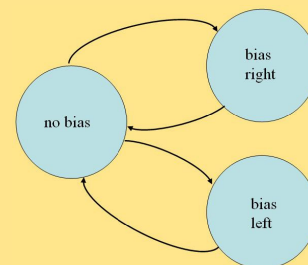
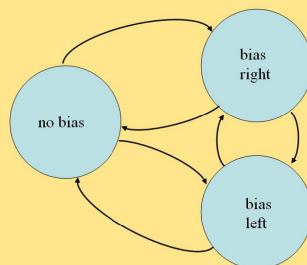
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- In the system model that allows for chattering, there can be instantaneous switching between biasing left and biasing right.
- Can remove Zeno behavior (chattering) in the system by removing the ability to instantaneously switch, i.e., by altering the model.



- Need to guarantee that the altered system still prevents collisions while removing Zeno.
- Need to compute the reachability sets.



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The Reach Set Problem

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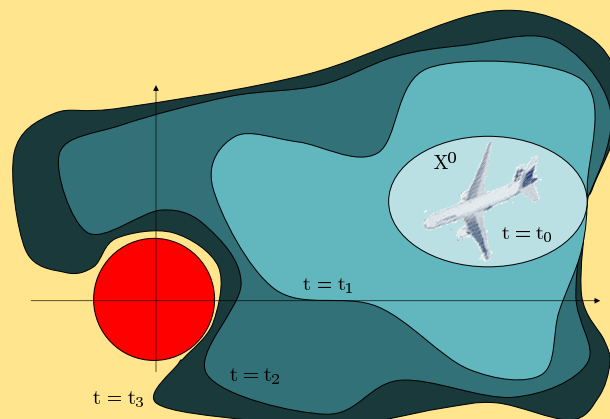
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Problem

Find the reach set $\mathcal{X}(t, t_0, X^0)$ of all states that can be reached at time t starting in X^0 at t_0 using open loop control $u(t)$





The Reach Set Problem: Linear Systems

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Problem

Find the reach set $\mathcal{X}(t, t_0, X^0)$ of all states that can be reached at time t starting in X^0 at t_0 using open loop control $u(t)$

Consider the linear control system

$$\dot{x}(t) = A(t)x(t) + B(t)u(t)$$

where $u(t) \in \mathcal{P}(t)$ and $x(t_0) \in X^0$ with

$$\mathcal{P}(t) = \mathcal{E}(p(t), P(t)), \quad X^0 = \mathcal{E}(x(t_0), X^0)$$

where $\mathcal{E}(z, Z) = \{x : (x - z)^T Z (x - z) \leq 1\}$ is an *ellipsoid* with center z and shape matrix Z .



Internal Point Problem

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Conclusion

- Calculate the reach set with specification of control for **each** point of the set.
- Reach the target point at **given** time t_1 .
- Reach the target point in the **shortest** time.
- Reach the target point at **some** time in the interval $[t_1, t_2]$.
- If the target point is unreachable, find the **nearest reachable** point.
- Recursive algorithms (use past computations for future computations to minimize computation costs).





Ellipsoidal Toolbox

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- Calculation of reach sets using ellipsoidal approximation algorithms.
- Visualization of their 3D projections.

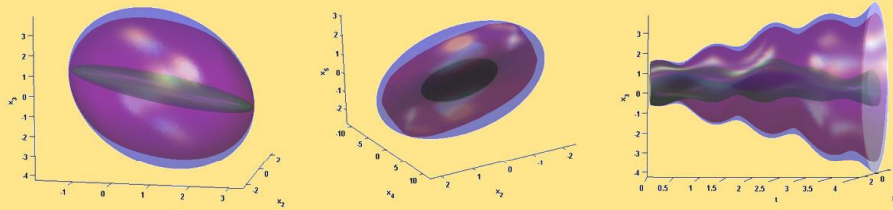
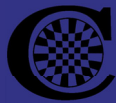


Figure: www.eecs.berkeley.edu/~akurzhan/ellipsoids



Future Work

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Conclusion

- Extend the results to the linear discrete-time systems.
- Extend the functionality of the Ellipsoidal Toolbox:
 - Dynamic projections,
 - Systems with uncertainty.
- Extend the results to hybrid systems.





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A Categorical Theory of Hybrid Systems

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Conclusion

- Issues:
 - Current models for hybrid systems are clumsy to manipulate mathematically: they have many different mathematical objects: edges, guards, resets, vector fields.
 - The tools of algebraic topology such as homology theory seem to be well suited to answering questions of existence and uniqueness, non-Zeno behavior of hybrid systems.
 - The ungainliness of the current models does not make this possible.
- Approach: Define hybrid systems using category theory.
 - Define a hybrid system in the formalism of category theory.
 - Preexisting constructions in category theory can be used to apply the tools of algebraic topology and homology theory to hybrid systems.
 - Practical and computable results pertaining to the composition of hybrid systems and Zeno classification can be derived.





Motivation: Morse Theory and Homology

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Conclusion

- Homology: Associates to a topological space a sequence of abelian groups.
 - Easier to understand these groups than the topological space.
 - Homology is invariant under deformations of the space.
- Morse theory relates the homology of a space with the behavior of vector fields on that space.
- Question: Can similar results be obtained for hybrid systems?
 - Can a homology theory be developed for hybrid systems?
 - If so, can this homology be used to say useful things about hybrid systems?
- Answer: Yes to all of the above.



Motivation: Morse Theory and Homology

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 - Easier to understand these groups than the topological space.
 - Homology is invariant under deformations of the space.
- Morse theory relates the homology of a space with the behavior of vector fields on that space.

Theorem

If \mathcal{H} is a hybrid system and \mathbb{H} its underlying "space" then

$$\chi(\mathbb{H}) := \sum_{i=0}^{\infty} (-1)^i \dim HH_i(\mathbb{H}, \mathbb{R}) = 1 \quad \Rightarrow \quad \mathcal{H} \text{ is not Zeno.}$$

when \mathbb{H} is contractible. Here $HH_i(\mathbb{H}, \mathbb{R})$ is the hybrid homology of \mathbb{H} .





Outline of Theory: Getting from Hybrid Systems to Homology

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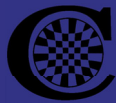
Conclusion

Classical Hybrid System

$$\mathcal{H}_C = (Q, E, D, G, R, F)$$

Hybrid Homology

$$HH_n(\mathbb{H}, A)$$



Outline of Theory: Obtaining Categorical Hybrid Systems

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Conclusion

Classical Hybrid Space

$$\mathbb{H}_C = (Q, E, D, G, R)$$



Categorical Hybrid Space

$$\mathbb{H} = (\mathfrak{H}, \mathbf{S}_{\mathbb{H}})$$

where $\mathbf{S}_{\mathbb{H}} : \mathfrak{H} \rightarrow \mathcal{T}\text{op}$

Classical Hybrid System

$$\mathcal{H}_C = (Q, E, D, G, R, F)$$



Categorical Hybrid System

$$\mathcal{H} = (\mathfrak{H}, \mathbf{S}_{\mathcal{H}})$$

where $\mathbf{S}_{\mathcal{H}} : \mathfrak{H} \rightarrow \mathcal{D}\eta\eta$



Hybrid Homology

$$HH_n(\mathbb{H}, A)$$





Correspondences

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Classical Hybrid Space

$$\mathbb{H}_C = (Q, E, D, G, R)$$

Classical Hybrid System

$$\mathcal{H}_C = (Q, E, D, G, R, F)$$



Categorical Hybrid Space

$$\mathbb{H} = (\mathfrak{H}, \mathbf{S}_{\mathbb{H}})$$

where $\mathbf{S}_{\mathbb{H}} : \mathfrak{H} \rightarrow \mathfrak{Top}$

Categorical Hybrid System

$$\mathcal{H} = (\mathfrak{H}, \mathbf{S}_{\mathcal{H}})$$

where $\mathbf{S}_{\mathcal{H}} : \mathfrak{H} \rightarrow \mathfrak{Dyn}$



Theorem

There are injective correspondences

$$\{\text{Classical Hybrid Spaces}\} \longrightarrow \{\text{Categorical Hybrid Spaces}\}$$

$$\{\text{Classical Hybrid Systems}\} \longrightarrow \{\text{Categorical Hybrid Systems}\}$$



Example: The Classical Bouncing Ball Hybrid Space

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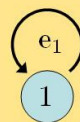
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Conclusion

- The hybrid system simulating the behavior of a bouncing ball is the standard example of a hybrid system that displays Zeno behavior.

- The hybrid space for the bouncing ball, \mathbb{H}_B , is given by:

- It has as its underlying graph $\Gamma_B = (Q, E)$ given by the diagram:



- The other elements of the hybrid space are defined as:

$$D_{e_1} = \{(x_1, x_2) : x_1 \geq 0\},$$

$$G_{e_1} = \{(0, x_2) : x_2 \leq 0\},$$

$$R_{e_1}(x_1, x_2) = (0, -cx_2).$$

Here $0 < c < 1$ is the amount of energy retained in each bounce.





Example: The Categorical Bouncing Ball Hybrid Space

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Conclusion

From the hybrid space for the bouncing ball \mathbb{H}_B we can construct a categorical hybrid space by defining \mathfrak{H} and $\mathbf{S}_{\mathbb{H}_B}$ as follows:

- \mathfrak{H} is given by the diagram:

$$\begin{array}{c} e \\ \alpha \downarrow \quad \downarrow \beta \\ \mathfrak{s}(e) = \mathfrak{t}(e) \end{array}$$

- $\mathbf{S}_{\mathbb{H}_B}$ is a functor defined by the diagram of topological spaces:

$$\begin{array}{ccc} \begin{array}{c} e \\ \alpha \downarrow \quad \downarrow \beta \\ \mathfrak{s}(e) = \mathfrak{t}(e) \end{array} & \xrightarrow{\mathbf{S}_{\mathbb{H}_B}} & \begin{array}{c} \{(0, x_2) : x_2 \leq 0\} \\ \text{id} \downarrow \quad \downarrow \begin{pmatrix} 0 \\ -cx_2 \end{pmatrix} \\ \{(x_1, x_2) : x_1 \geq 0\} \end{array} \end{array}$$



Outline of Theory: Obtaining a Topological Space

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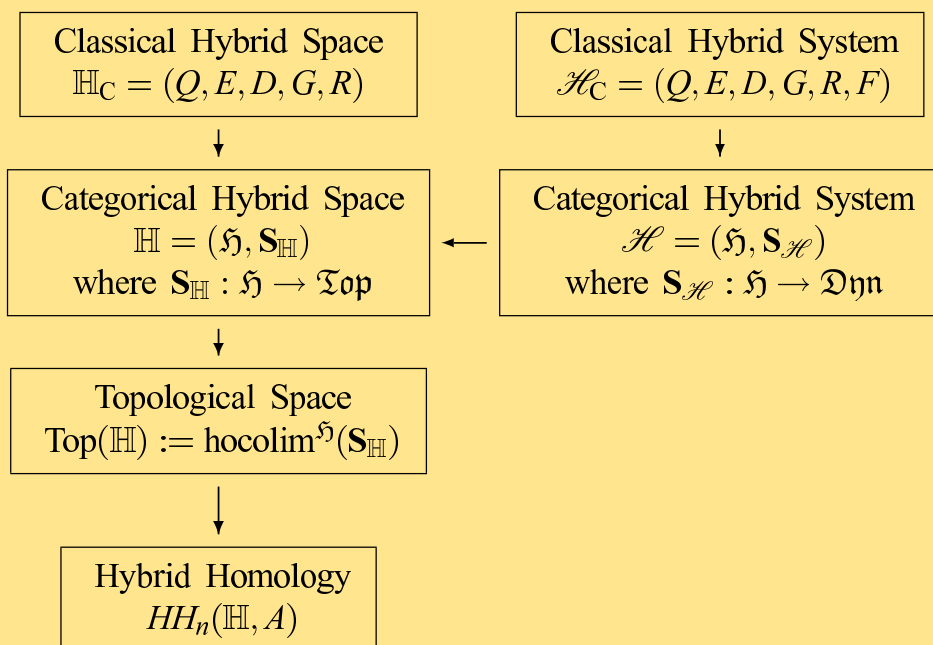
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Topology of Hybrid Systems

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Categorical Hybrid Space
 $\mathbb{H} = (\mathfrak{H}, \mathbf{S}_{\mathbb{H}})$
where $\mathbf{S}_{\mathbb{H}} : \mathfrak{H} \rightarrow \mathcal{T}\text{op}$



Topological Space
 $\text{Top}(\mathbb{H}) := \text{hocolim}^{\mathfrak{H}}(\mathbf{S}_{\mathbb{H}})$



Hybrid Homology
 $HH_n(\mathbb{H}, A) := H_n(\text{Top}(\mathbb{H}), A)$

- Associates to a hybrid space a single topological space through well known constructions in algebraic topology.
- Can associate to this topological space its homology; this yields a homology theory for hybrid systems: **hybrid homology**.
- This topological space and its homology give useful information about the hybrid system.



Example: The Topological Space of the Bouncing Ball

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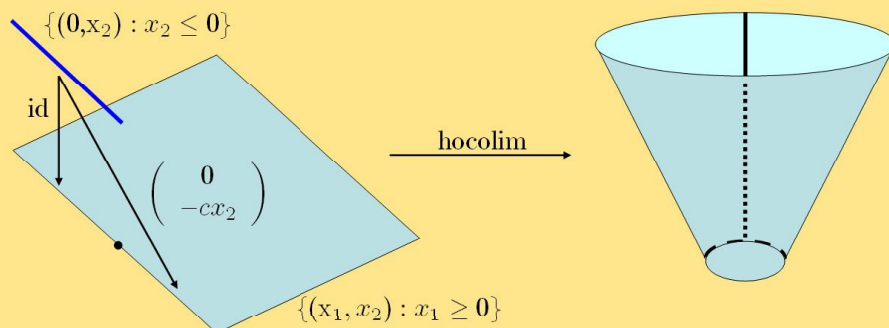
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Conclusion

The underlying topological space of the bouncing ball is given by:

$$\text{Top}(\mathbb{H}_B) = \text{hocolim}^{\mathfrak{H}}(\mathbf{S}_{\mathbb{H}_B}) = \text{Punctured Cone.}$$

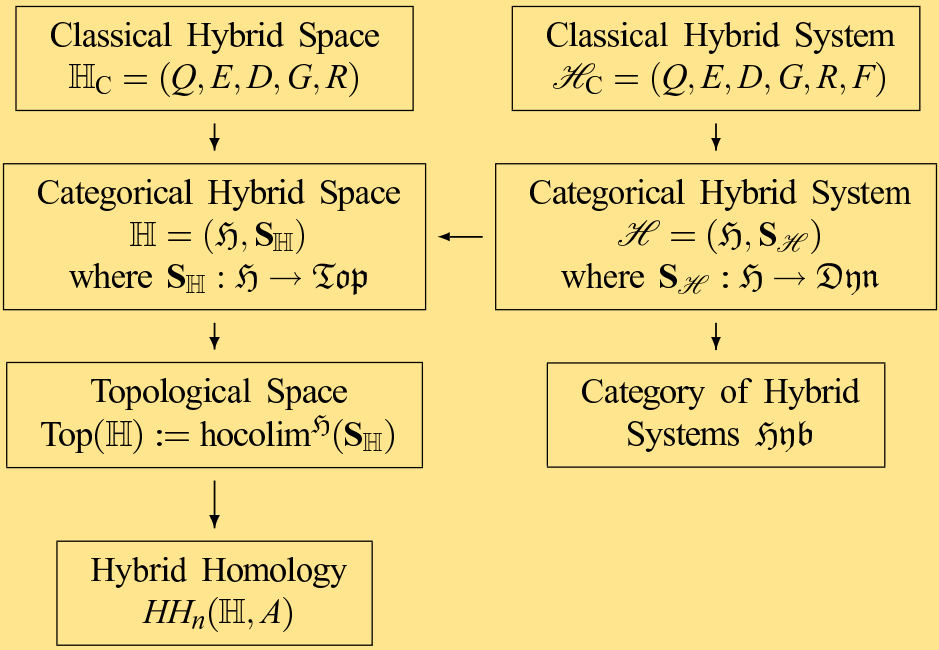




Outline of Theory: Obtaining the Category of Hybrid Systems

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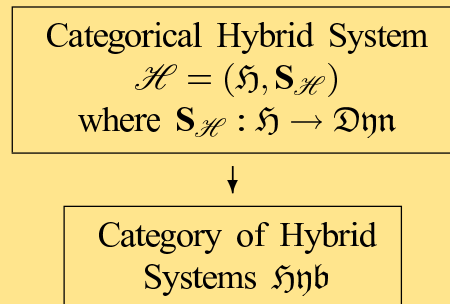


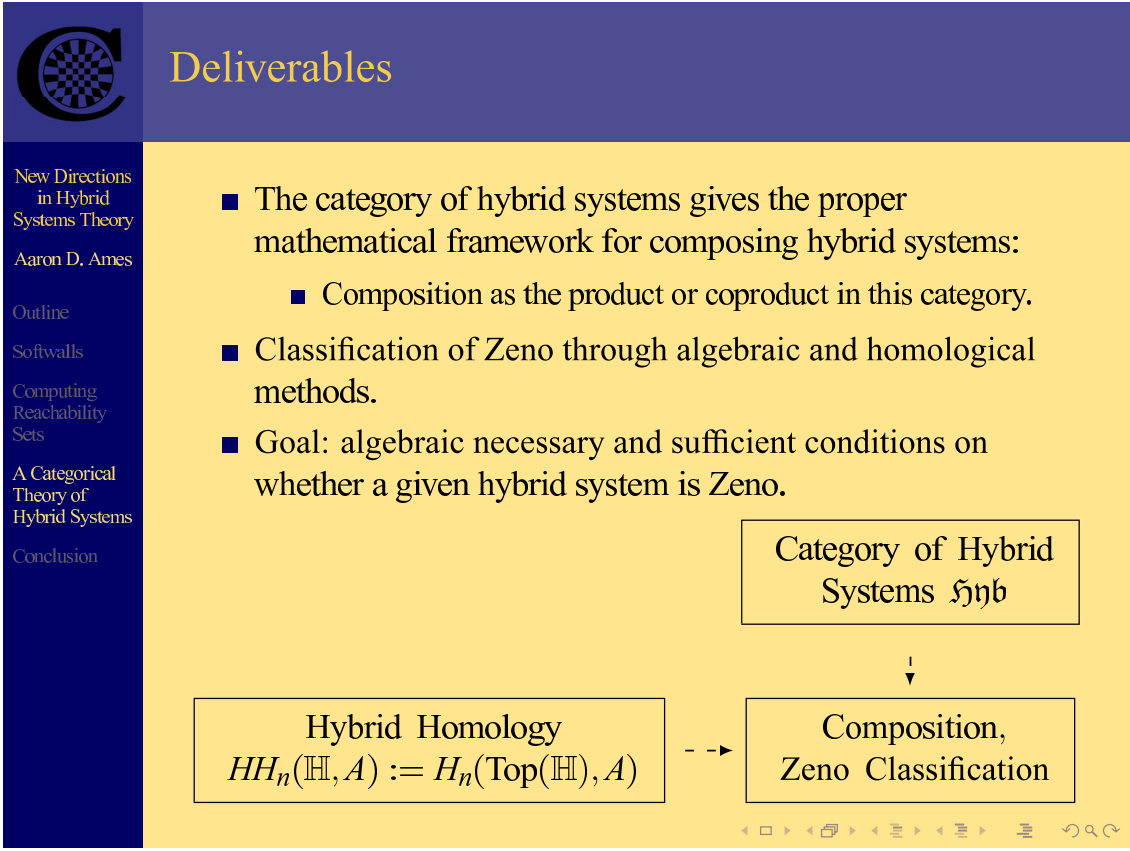
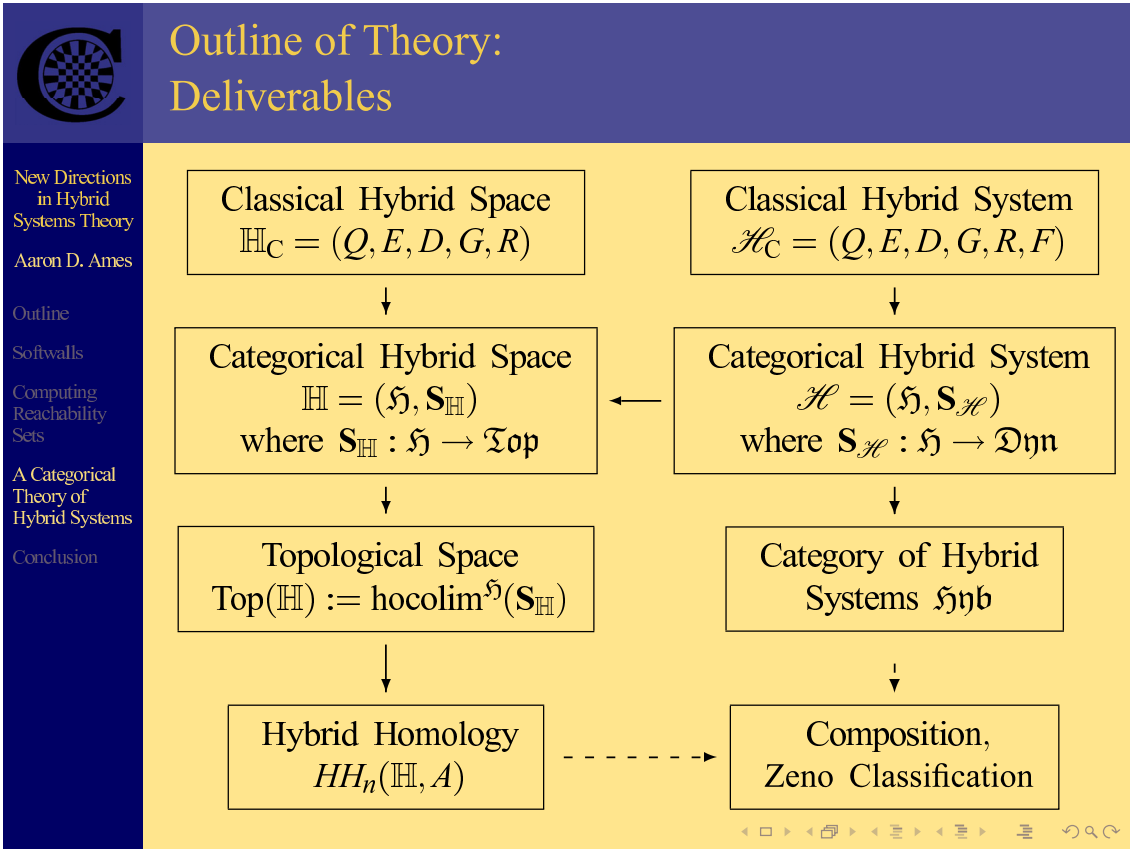
The Category of Hybrid Systems

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- The category of hybrid systems is a "graph" whose vertices are hybrid systems and whose edges are morphisms between hybrid systems.
- Gives the proper framework for understanding multiple hybrid systems and their interactions.
- Allows the mature subject of category theory to be applied to hybrid systems.







Zeno Classification through Homology

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Theorem

Let Γ be the underlying graph of a hybrid system \mathcal{H} and \mathbb{H} its underlying hybrid space. Then,

$$\dim(HH_1(\mathbb{H}, \mathbb{R})) = \dim(\mathcal{N}(K_\Gamma)) = 0 \Rightarrow \mathcal{H} \text{ is not Zeno.}$$

Here $\mathcal{N}(K_\Gamma)$ is the nullspace of the incidence matrix, K_Γ , of the graph Γ .

Note that $\dim HH_1(\mathbb{H}_B, \mathbb{R}) = 1$, so we cannot conclude that the bouncing ball is not Zeno (which is good since it is Zeno).

$$\text{Hybrid Homology} \\ HH_n(\mathbb{H}, A) := H_n(\text{Top}(\mathbb{H}), A)$$

- ->

Zeno Classification



Zeno Classification through Homology

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Corollary

If \mathcal{H} is a hybrid system and $\mathbb{H} = (\mathfrak{S}, \mathbf{S}_{\mathbb{H}})$ its underlying hybrid space then

$$\chi(\mathbb{H}) = |\mathcal{D}\mathfrak{b}(\mathfrak{S})| - |\mathfrak{M}\mathfrak{o}\mathfrak{t}(\mathfrak{S})| = 1 \Rightarrow \mathcal{H} \text{ is not Zeno.}$$

when \mathbb{H} is contractible.

Note that $\chi(\mathbb{H}_B) = 0$, so we cannot conclude that the bouncing ball is not Zeno (which is good since it is Zeno).

$$\text{Hybrid Homology} \\ HH_n(\mathbb{H}, A) := H_n(\text{Top}(\mathbb{H}), A)$$

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Zeno Classification





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- The research directions outlined here range from the practical to the theoretical:
 - Practical: Real world Applications (softwalls) and toolboxes for hybrid systems,
 - Theoretical: New directions in hybrid systems theory.
- The practical will affect the theoretical and vice versa:

Eric Temple Bell

“Abstractness, sometimes hurled as a reproach at mathematics, is its chief glory and its surest title to practical usefulness.”

