

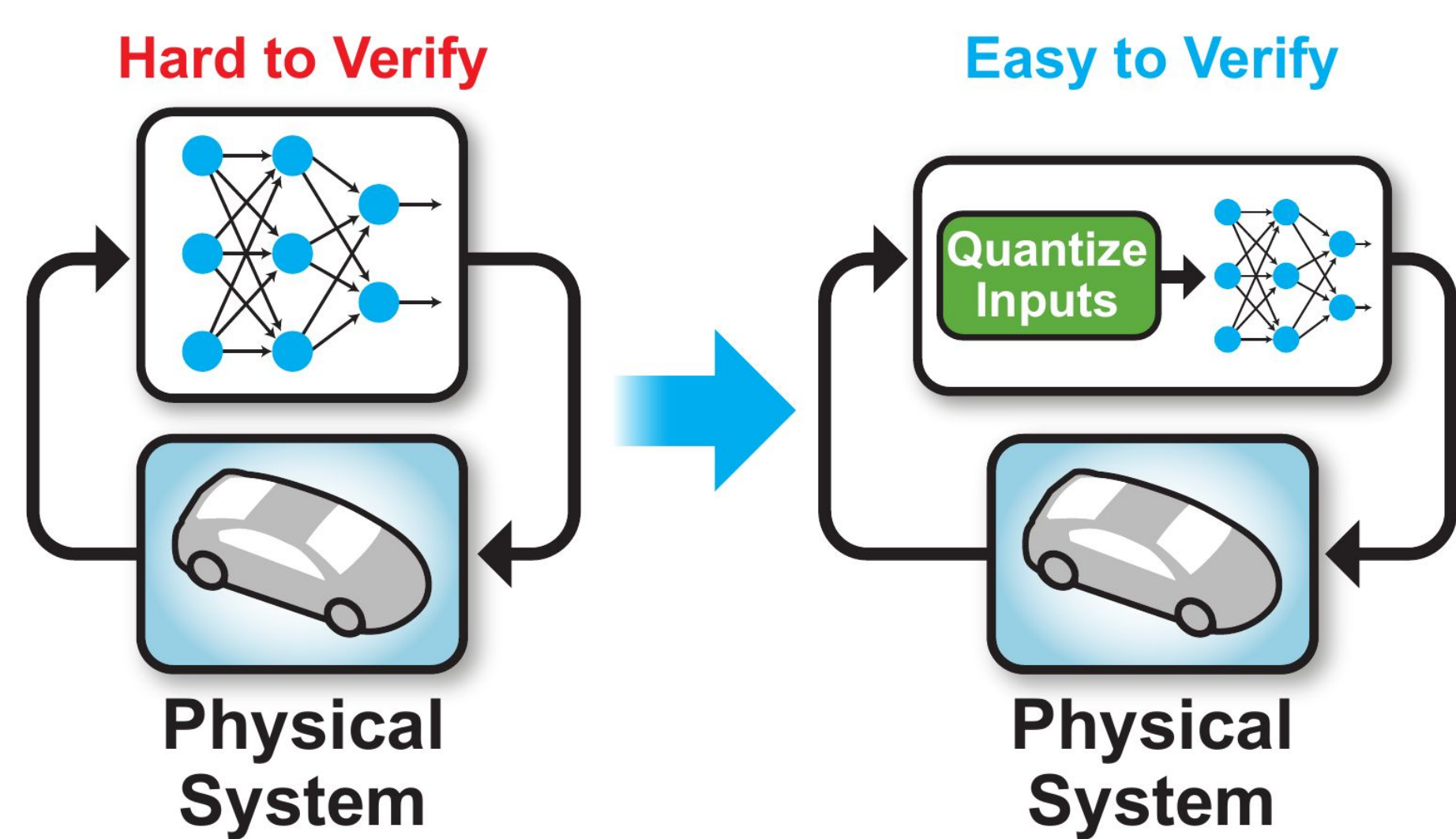
# CAREER: Verified AI in Cyber-Physical Systems through Input Quantization

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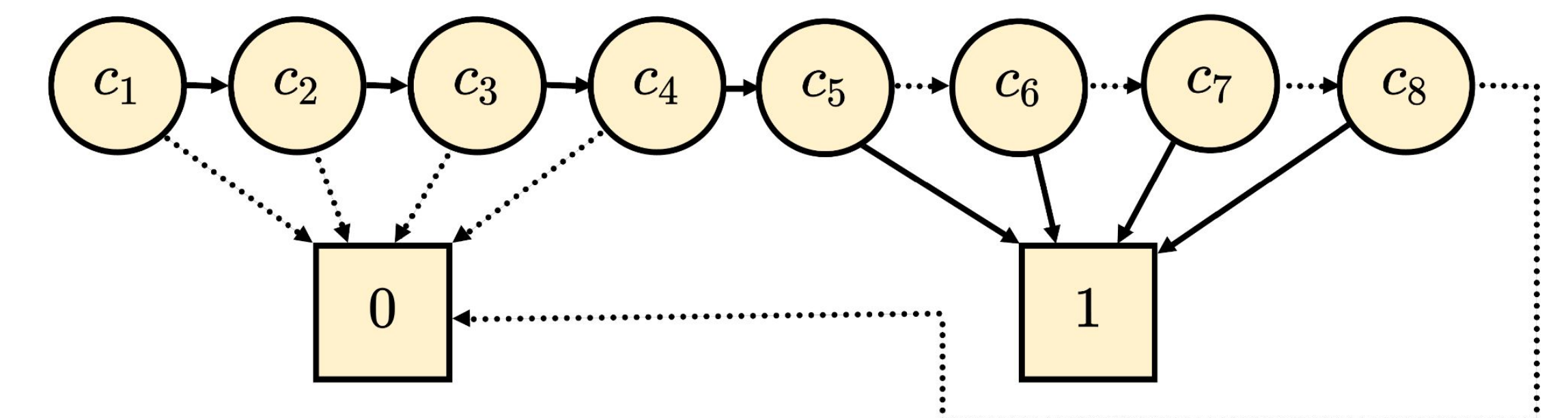
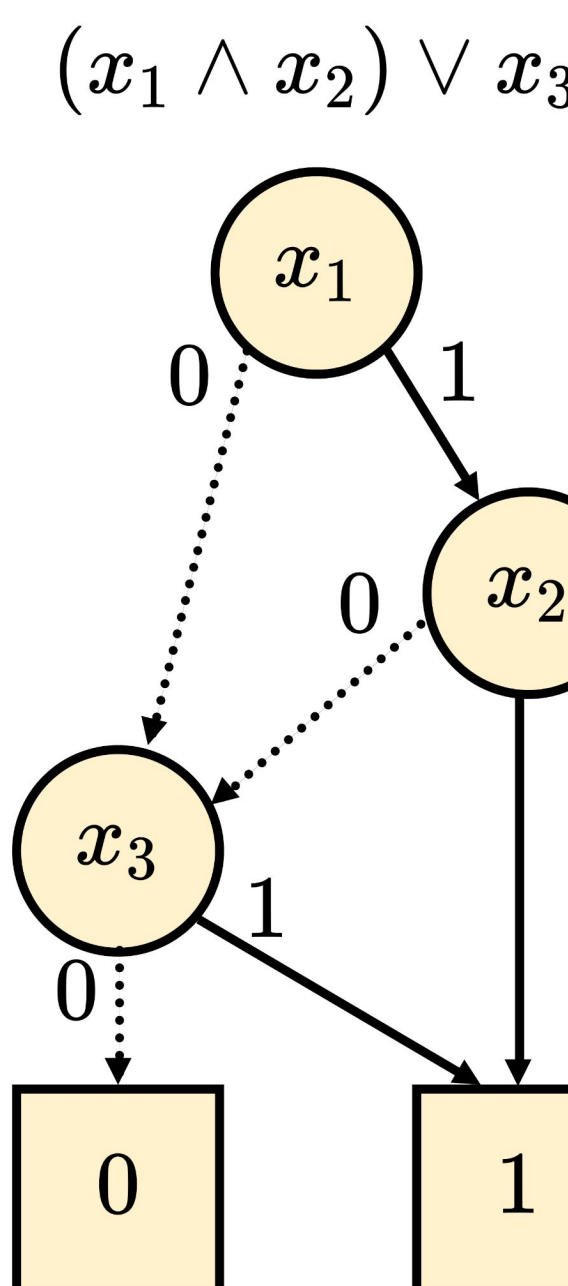
Project Started: 8-2023

**Goal:** Practical formal verification for neural network control systems with small numbers of inputs

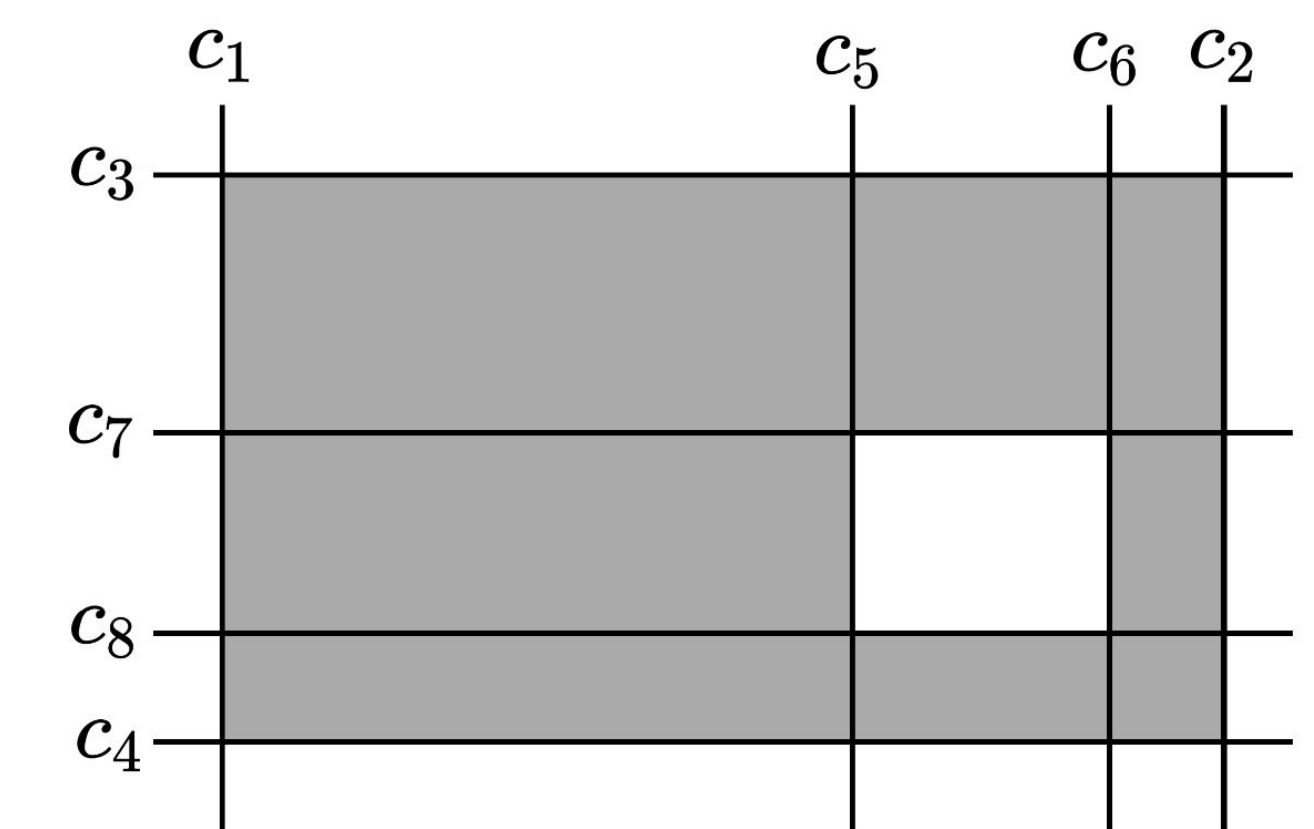
**How:** Approximate NN by quantizing (rounding) inputs. Then use batch execution rather than NN verification.



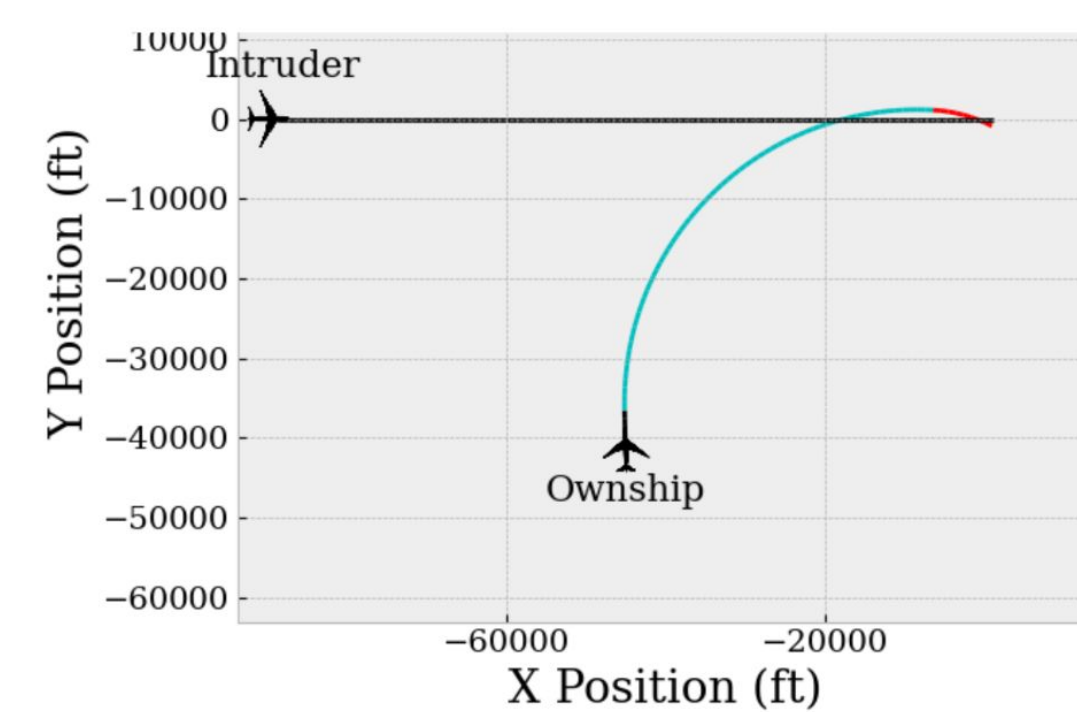
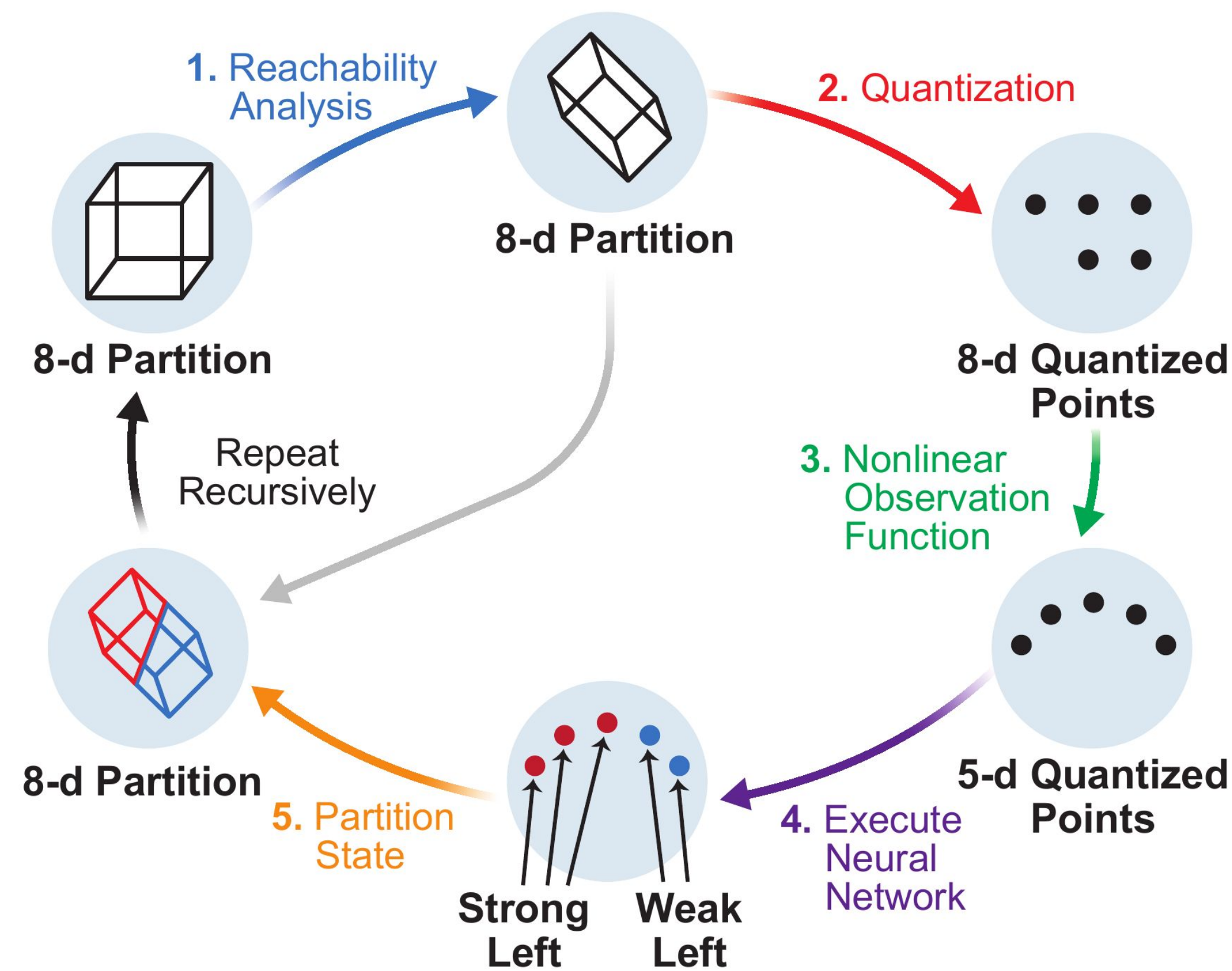
We also plan to investigate non-convex set representations based on binary decision diagrams (BDDs) called linear constraint decision diagrams (LCDDs).



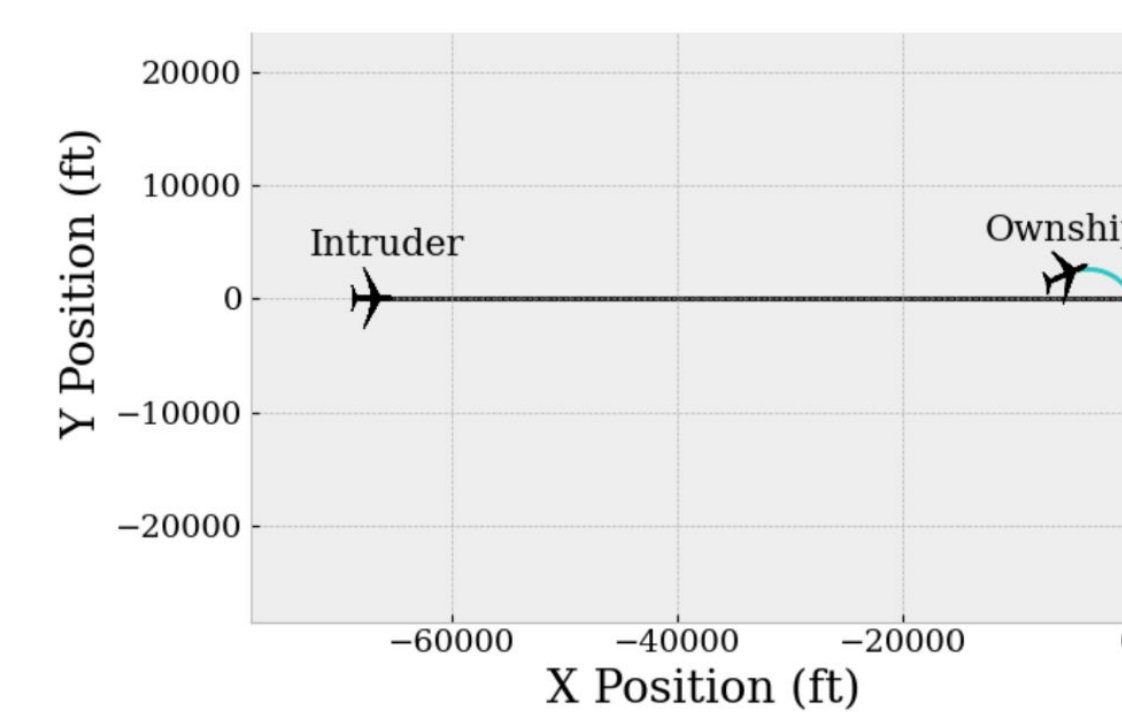
Name	Equation
$c_1$	$x \geq 0$
$c_2$	$x \leq 10$
$c_3$	$y \leq 6$
$c_4$	$y \geq 0$
$c_5$	$x \leq 6$
$c_6$	$x \geq 9$
$c_7$	$y \geq 3$
$c_8$	$y \leq 1$



Key question: How can we do reduction?



(a) Fast Ownship Keeps Turning.



(b) Safety System Causes Crash.

Closed-loop verification combines batch execution with reachability analysis.

Two examples closed-loop trajectories from ACAS Xu neural network compression which were found to be unsafe.

On the right, LCDDs from the union operation:  $[0, 4] \cup [3, 5]$

We can represent it with two constraints, but reduction from root gives 3.

