



# Proofs in the Pilot's Seat



Toward Verified Simultaneous Maneuvers in the Next-Generation  
Airborne Collision Avoidance System

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# Who Came Here By Plane?

...

**Want to Get Home Alive?**

...

# Background: Collision Avoidance

- Onboard collision avoidance offers last-minute advice to pilots
- Aircraft remains under human control
- Current Generation: TCAS
- Next Generation: ACAS X
  - Enable denser airspace by reducing spurious alerts
  - Improve safety beyond levels achieved by TCAS



**Image Source:** FlySafe Project - <http://www.eu-flysafe.org/Project/Aviation-Hazards/Air-Traffic/current-systems.html>

# Background: ACAS X Verification

- ACAS X implementation extremely large
  - Lookup table with millions of states
- ACAS X *output* extremely simple
  - One of twelve maneuvers
- Idea: Verify correctness of *output*, not *implementation*.
- Verification approach:
  - Exhaustive testing (cover entire lookup table)
  - Compute safe maneuvers for each state
  - Compare with ACAS X output
  - **Verify correctness of “safe maneuvers” computation**

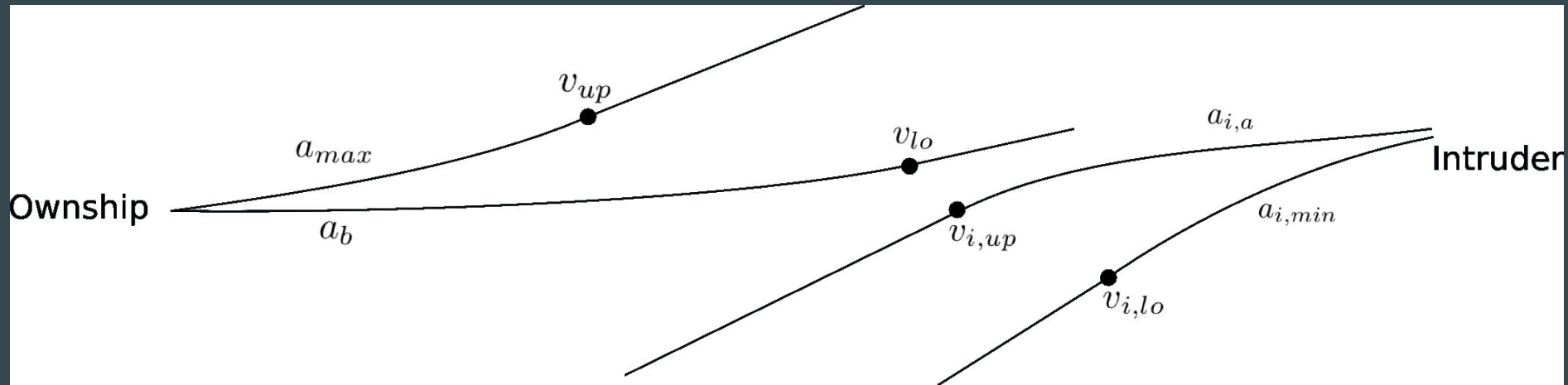
# Using Verification in the Implementation

- **Problem:** Not all ACAS X bugs easily fixed by changing lookup table
- **Solution:** Use safety analysis *in production* to provide safer advice
- Compare ACAS X result with list of safe maneuvers
- If given unsafe maneuver when safe one exists, **change it!**
- **Problem:** *Really* need to trust the safety analysis
- Need to generalize previous verification results



# Project: Verified Simultaneous Maneuvers

- **Prior work (by others):** Assumes intruder aircraft moves in straight line.
- What if both aircraft are equipped with ACAS X?
- What if intruder aircraft makes evasive maneuvers?
- What if intruder aircraft behaves randomly?
- **Solution:** Model encounters where both aircraft maneuver



# Modeling: Dynamics

- Assumption: Aircraft flying head-on
- Assumption:
  - Constant horizontal velocity
- Vertical acceleration changes discretely
- Vertical trajectory:
  - Sequence of parabolas
- Differential Equation:
  - $r' = -vr$ ,
  - $h' = v$ ,  $v' = a$ ,
  - $h_i' = v_i$ ,  $v_i' = a_i$

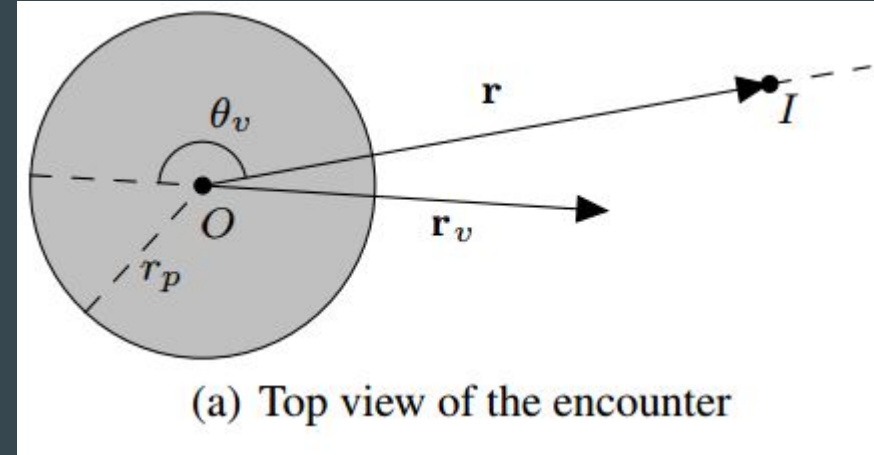
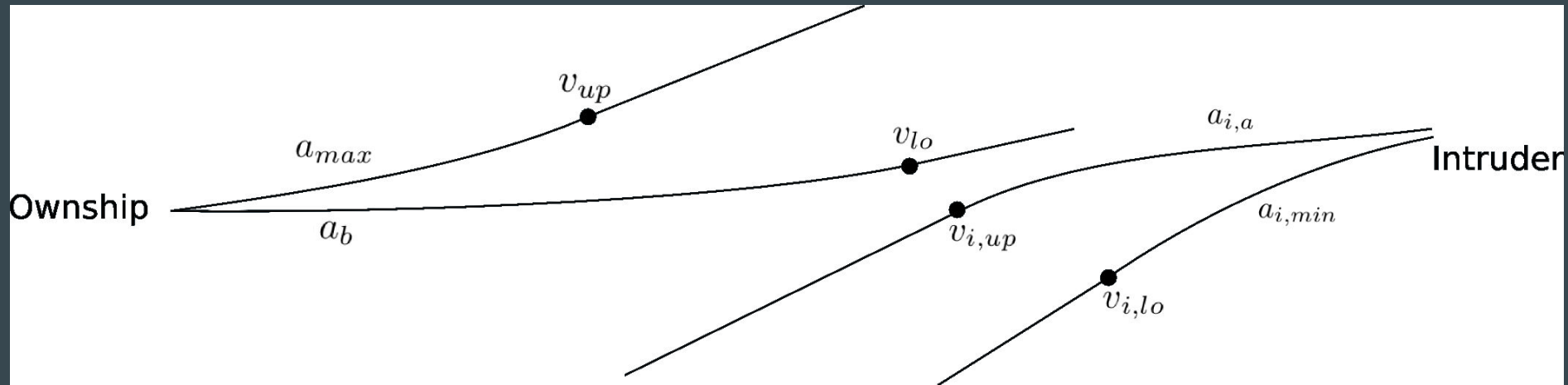


Image Source: [JBJ2105]



# (Prior Work) Modeling: Maneuvers

- Bounds  $a_{\min} \leq a \leq a_{\max}$  obeyed at all times
- Target velocity range  $v_{\min} \leq v \leq v_{\max}$
- Accelerate with acceleration  $a_a$  or  $a_b$  to achieve desired velocity



# Contribution: Safe Regions

- Maneuver safe iff ownship is *always above* or *always below* intruder
- Compute acceleration lower bound  $a_{lo}$ 
  - “Is the aircraft forced to accelerate upward?”
- Compute acceleration upper bound  $a_{up}$  in  $\{a_{max}, a_a\}$ 
  - “Is the aircraft forced to accelerate downward?”
- At all points in trajectory, ownship and intruder bounds separated

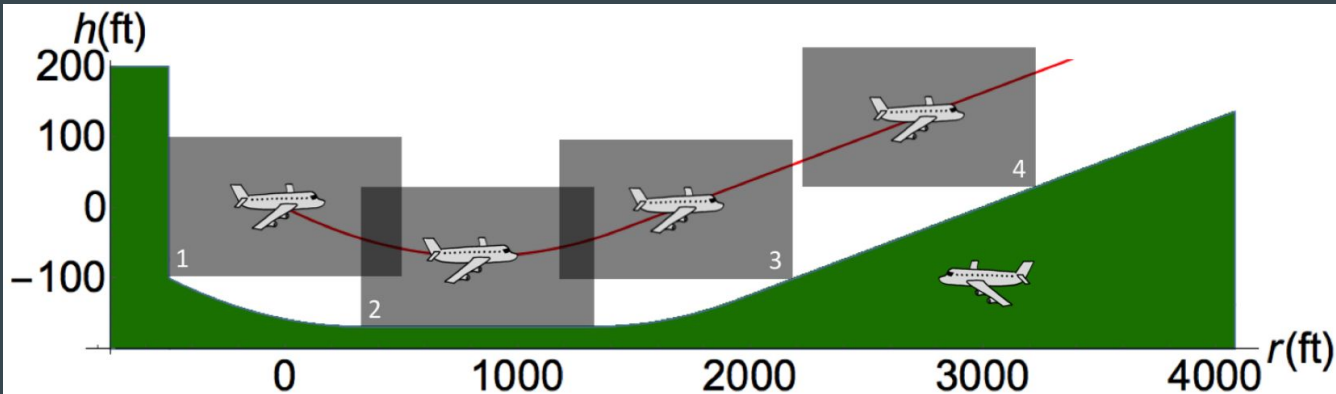
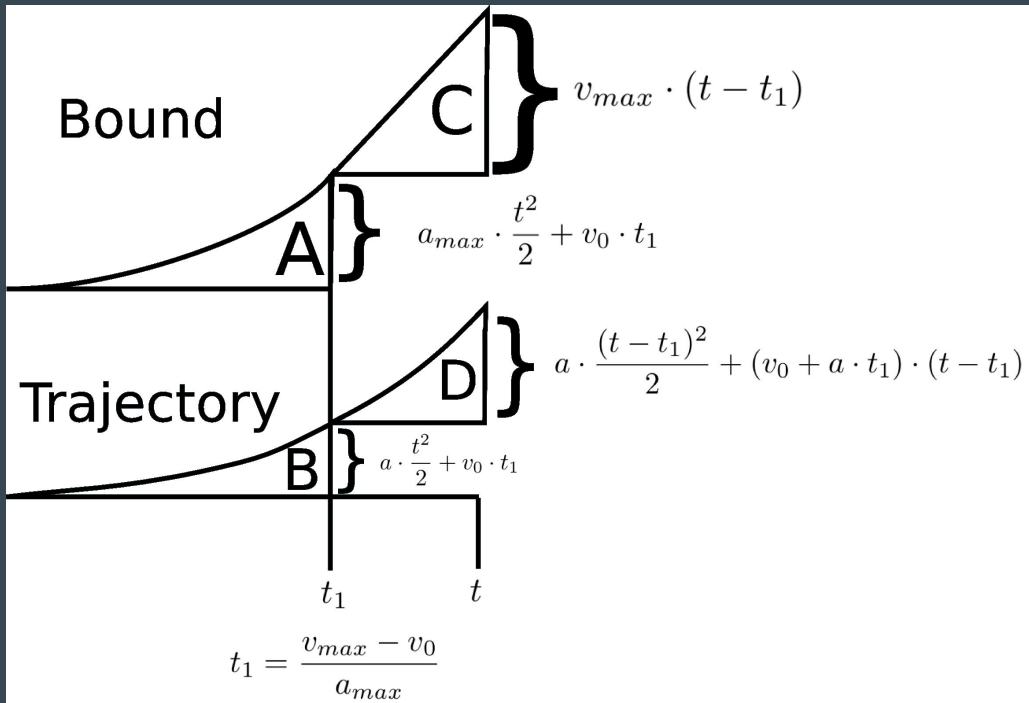


Fig. 1 Nominal trajectory of the ownship (red) and safe region for the intruder (green), immediate response

# Contribution: Proof

- Always above intruder vs. always below intruder (2 cases)
- Constraints on  $a_{lo}$ ,  $a_{up}$ ? (4 cases)
- Is each trajectory quadratic or linear? (4 cases)
- In total:  $2 * 2 * 4 = 32$  cases
- Each case: First-order arithmetic problems
- Use custom tactic library for arithmetic proofs
- **Current progress:** 2 - epsilon cases (this proof is hard)
  - Third case somewhat harder
  - Many other cases are symmetric

# Proof Example: Linear-Quadratic Case



1.  $B + D \leq A + C$
2.  $a \leq a_{max}$
3.  $A \cdot \frac{t - t_1}{2} + (v_0 + a \cdot t_1)$   
 $\leq v_0 + a \cdot (t_1 + (t - t_1))$   
 $= v$   
 $\leq v_{max}$

# References

- A Formally Verified Hybrid System for Safe Advisories in the Next-Generation Airborne Collision Avoidance System. Jean-Baptiste Jeannin, et. al. Manuscript, November 2015
- Yanni Kouskoulas, et. al. Safe advisories for ACAS X in the presence of curved trajectories and non-deterministic intruder behavior. Unpublished Work (in progress), 2016.
- Mykel J. Kochenderfer and James P. Chryssanthacopoulos. Robust airborne collision avoidance through dynamic programming. Project Report ATC-371, MIT Lincoln Laboratory, 2011.