

and produces random control input $u_t \in \mathcal{U}$ for each epoch. The safety controller is invoked once $h(x) < 0$. Once the yaw rate exceeds 0.025 (from the first to seventh epoch in Fig. 2), the safety controller drives the yaw rate to \mathcal{C} . Note that the simplex architecture assumes that there exists no adversary, which is different with Scenario I and II.

Therefore, the control policy computed using our proposed algorithm ensures safety of the system with respect to specified budget for any of the CRAs or the simplex architecture.

VII. CONCLUSION

In this paper, we studied the problem of developing a common framework that allows safety analysis and control synthesis of CPS adopting the simplex architecture or the set of cyber resilient architectures including BFT++. We presented the models for cyber and physical subsystems, and formulated the safety property using a budget constraint. Our formulation captures strict safety constraint as a special case. We constructed a hybrid system that models CPS implementing any of these architectures. We derived a set of sufficient conditions for the control policy to satisfy the budget constraint. We translated the conditions into a set of sum-of-squares constraints, and proposed an algorithm to compute the control policy. We analyzed the convergence and complexity of the algorithm. A case study on the lateral control of a Boeing 747 was presented to demonstrate viability of our proposed framework.

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