

# Bifurcation Analysis of Cardiac Alternans using $\delta$ -Decidability

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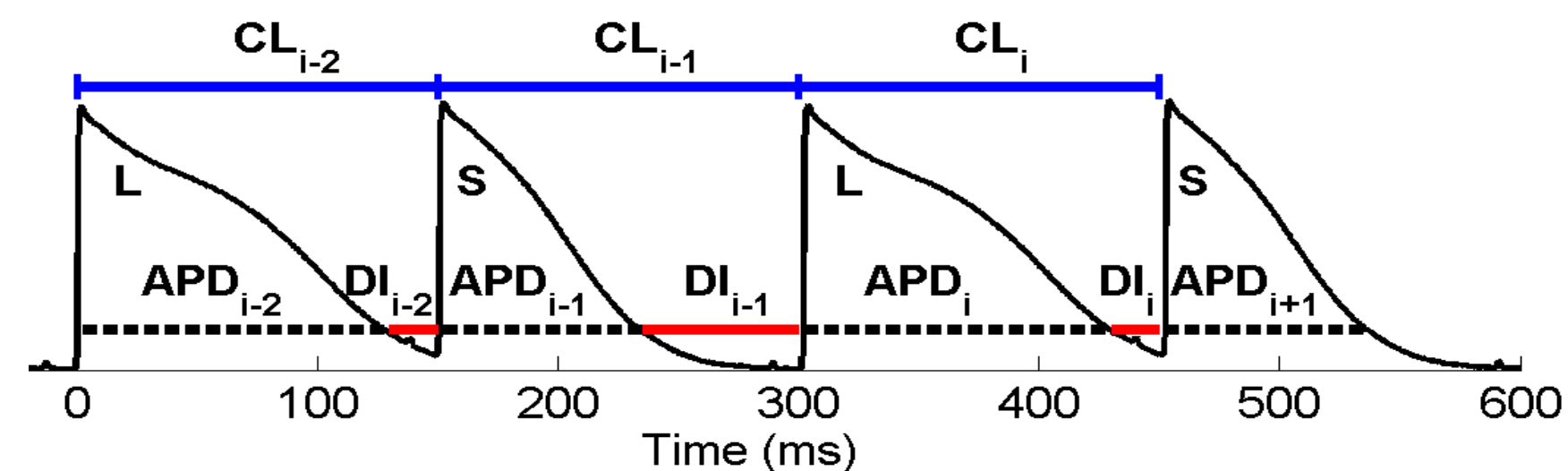
## PROJECT SUMMARY

Electrical alternans is a phenomenon characterized by a variation in the successive Action Potential Durations (APDs) generated by a single cardiac cell or tissue. Alternans are known to initiate re-entrant waves and are an important physiological indicator of an impending life-threatening arrhythmia such as ventricular fibrillation. The bifurcation analysis we perform determines, for each control parameter  $\tau$  of the MS model, the bifurcation point in the range of  $\tau$  such that a small perturbation to this value results in a transition from alternans to non-alternans behavior. To the best of our knowledge, our analysis represents the first formal verification of non-trivial dynamics in a numerical cardiac-cell model.

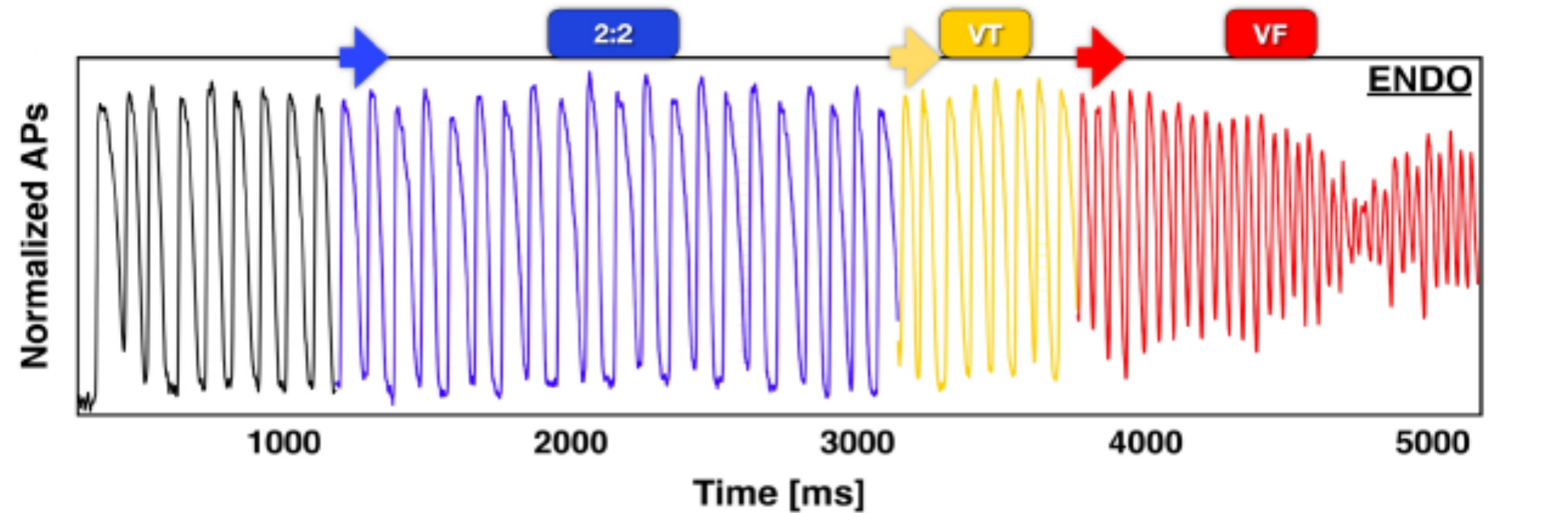
Our approach to this problem rests on encoding alternans-like behavior in the MS model as a 11-mode, multinomial hybrid automaton (HA). For each model parameter, we then apply a sophisticated, guided-search- based reachability analysis to this HA to estimate parameter ranges for both alternans and non-alternans behavior. The bifurcation point separates these two ranges, but with an uncertainty region due to the underlying  $\delta$ -decision procedure. This uncertainty region, however, can be reduced by decreasing  $\delta$  at the expense of increasing the model exploration time.

## BACKGROUND & MOTIVATION

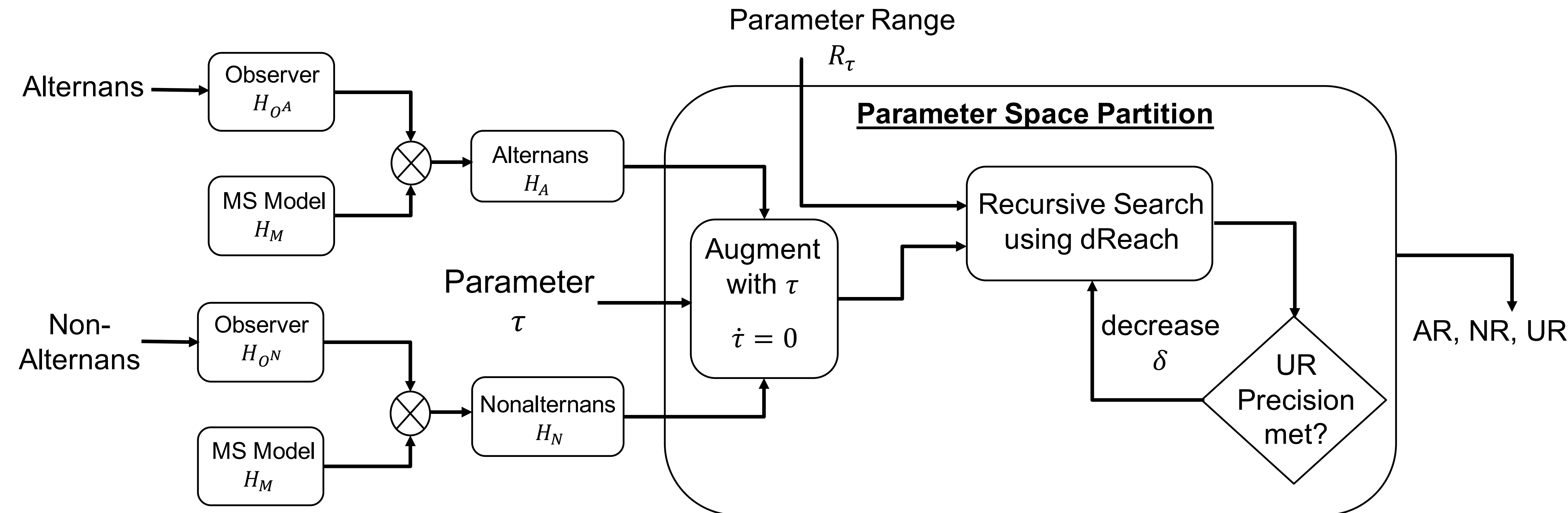
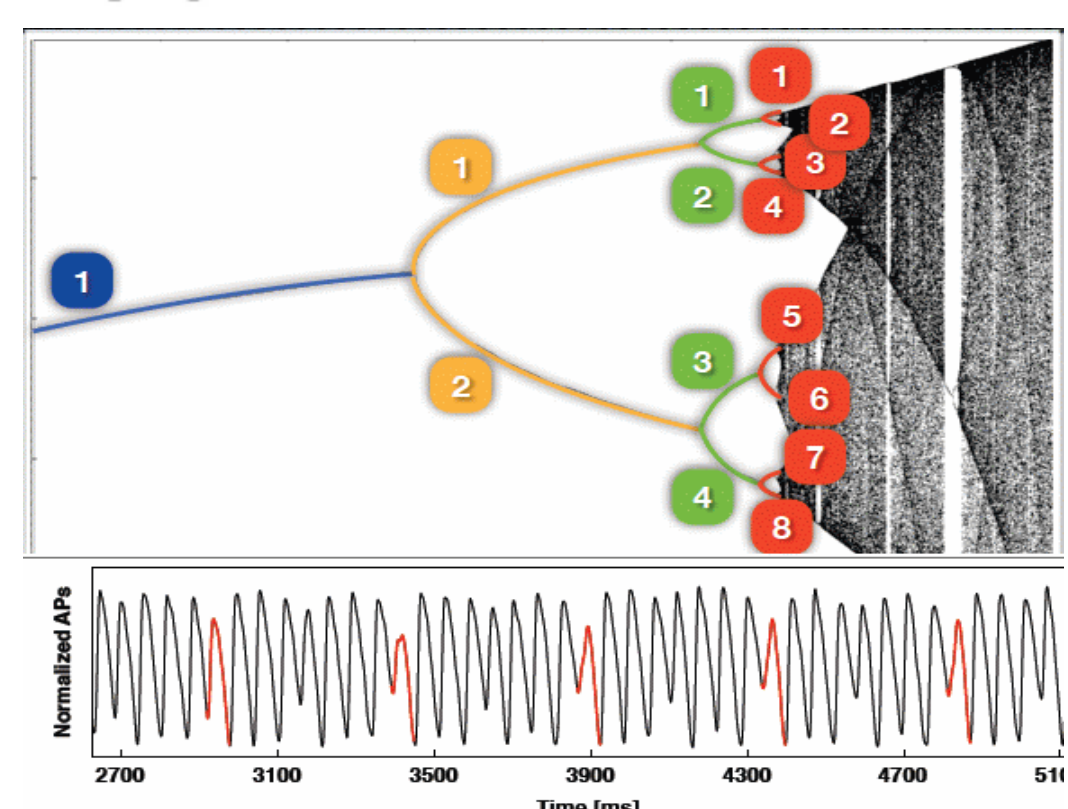
- Cardiac alternans appears as a beat-to-beat long-short alternation of action potential duration (APD)



- Alternans often leads to fibrillation

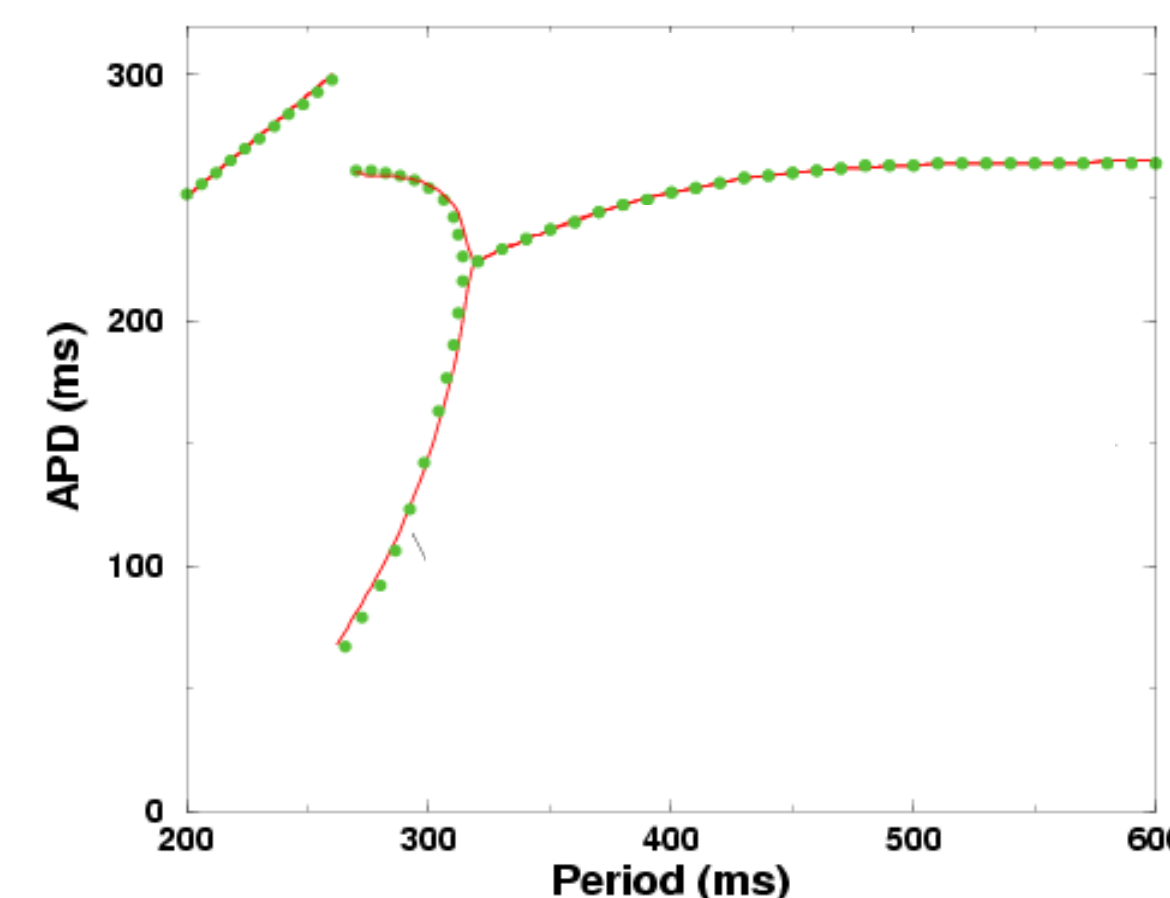


- Period-doubling leads to chaos

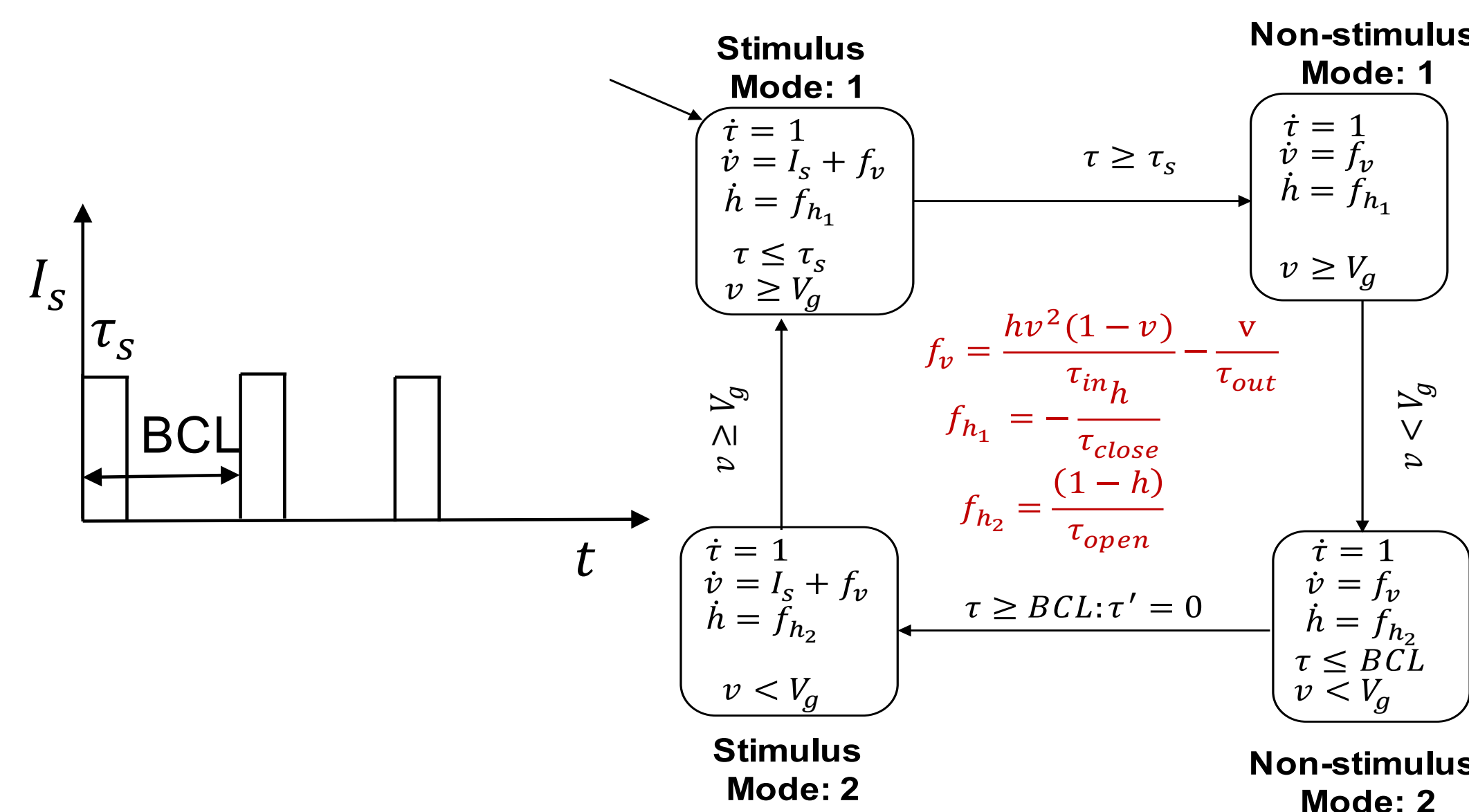


## BIFURCATION ANALYSIS OF ALTERNANS

- Finding bifurcation points (BPs) that split the parameter space into **alternans** and **non-alternans** regions



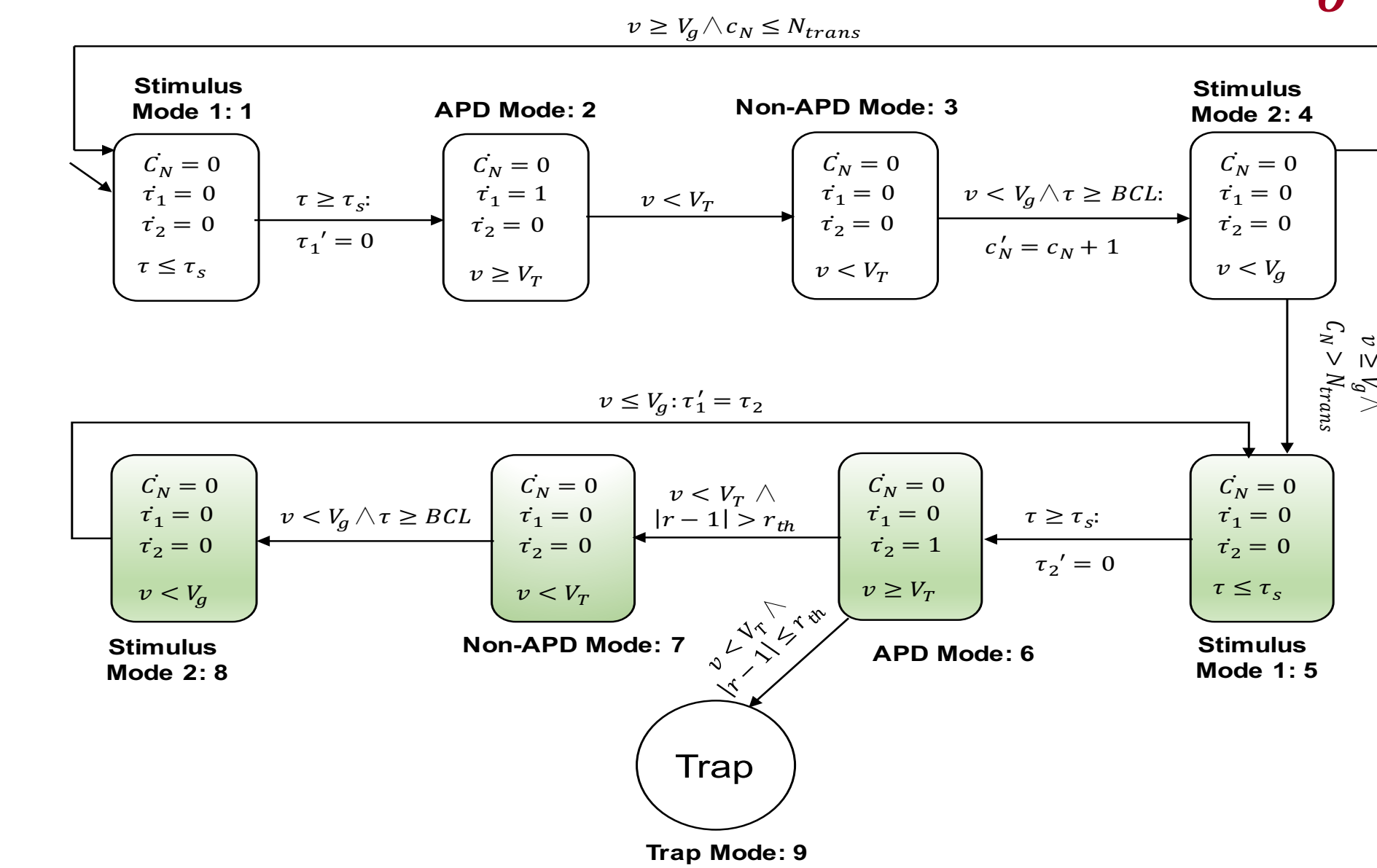
## MITCHELL-SCHAEFFER (MS) MODEL



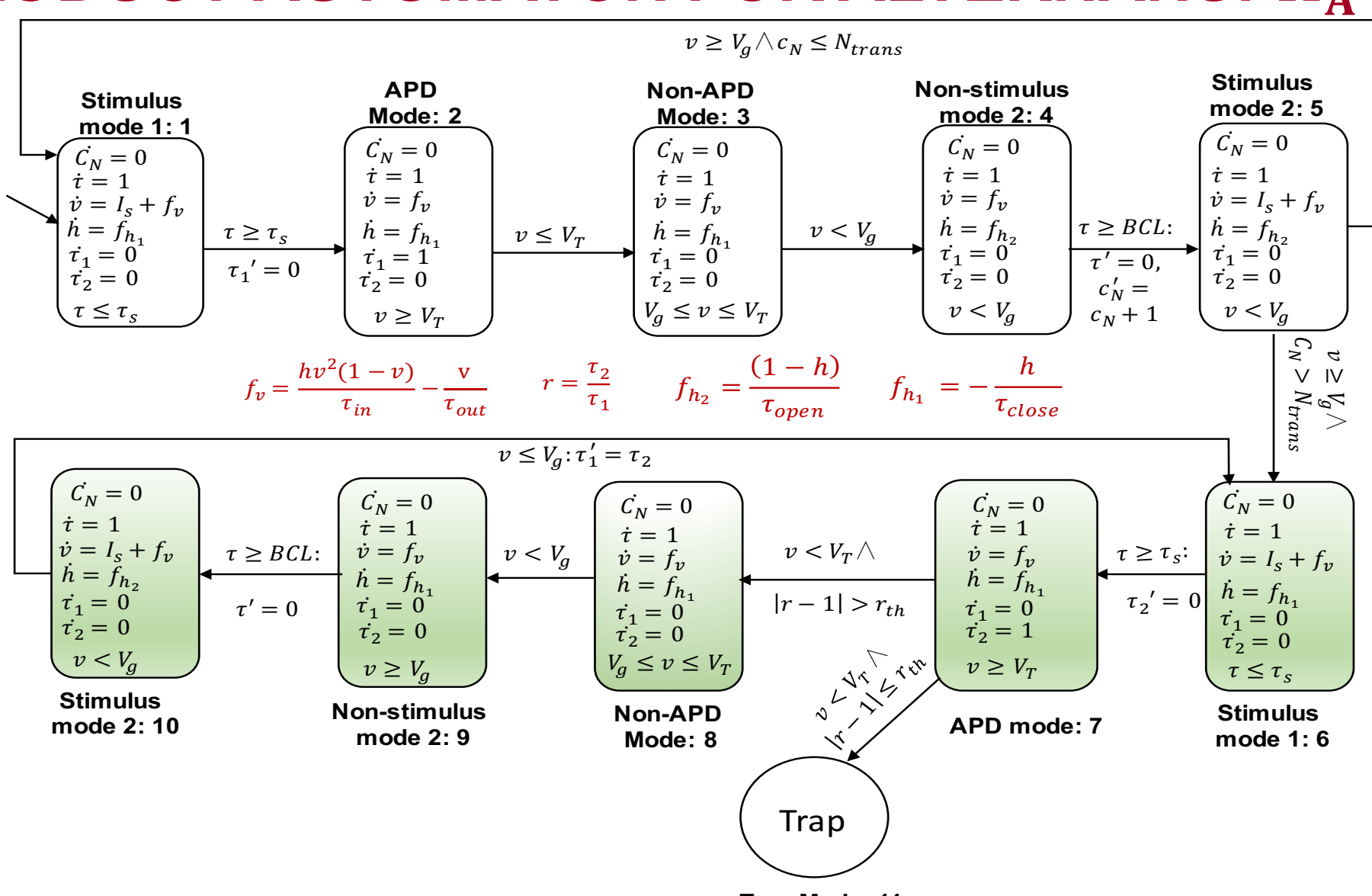
## FORMAL DEFINITION OF ALTERNANS

- Given,
- $\sigma$ : (possibly infinite) voltage signal
  - $\tau_1 > 0$  and  $\tau_2 > 0$ : APDs two consecutive AP cycles where  $r = \tau_2/\tau_1$
  - $\sigma$  exhibits: **alternans (non-alternans)** with respect to  $r_{th}$  when  $|r - 1| > r_{th}$  ( $|r - 1| \leq r_{th}$ ) is invariant

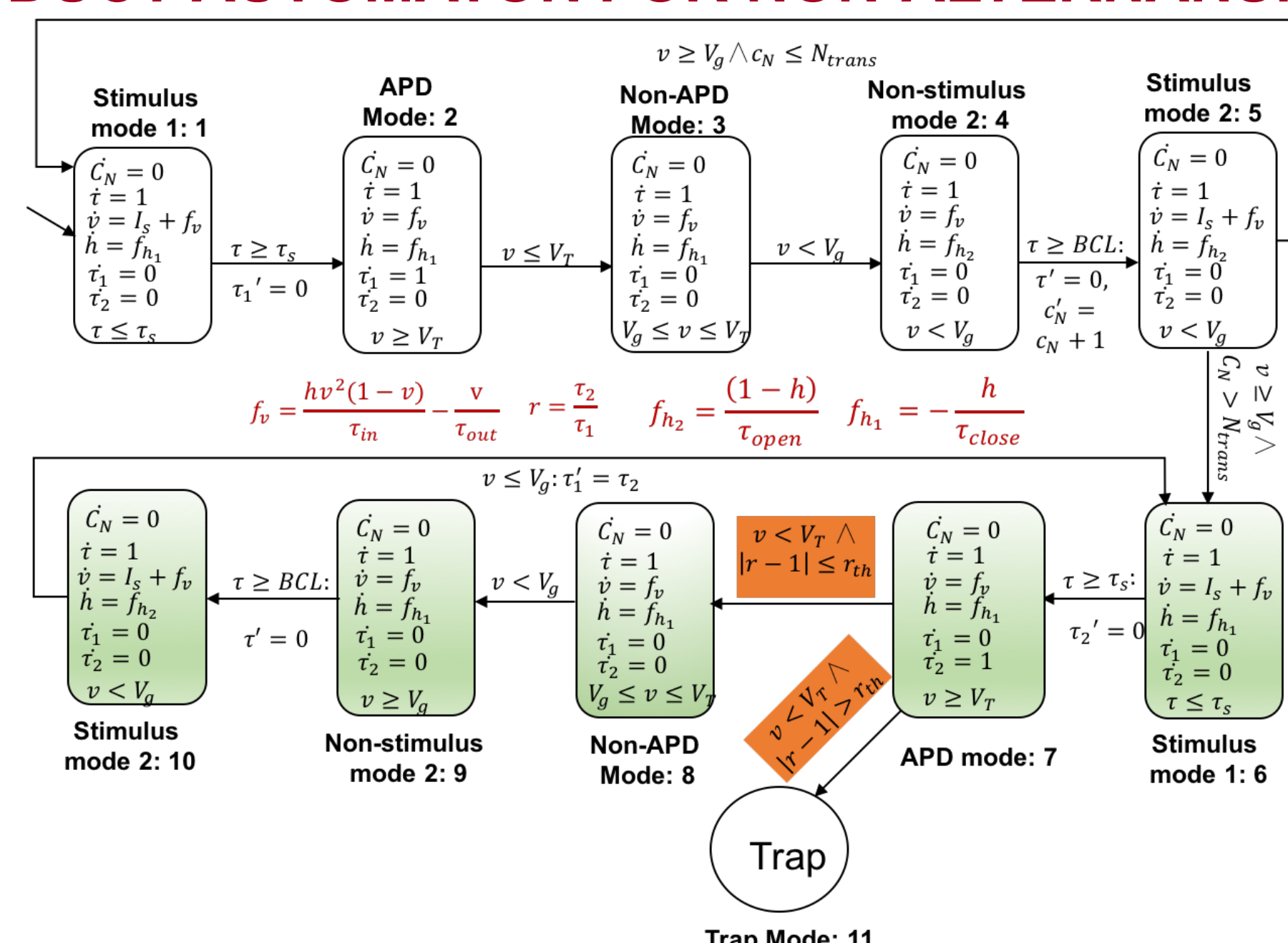
## OBSERVER AUTOMATON FOR ALTERNANS: $H_{O^A}$



## PRODUCT AUTOMATON FOR ALTERNANS: $H_A$

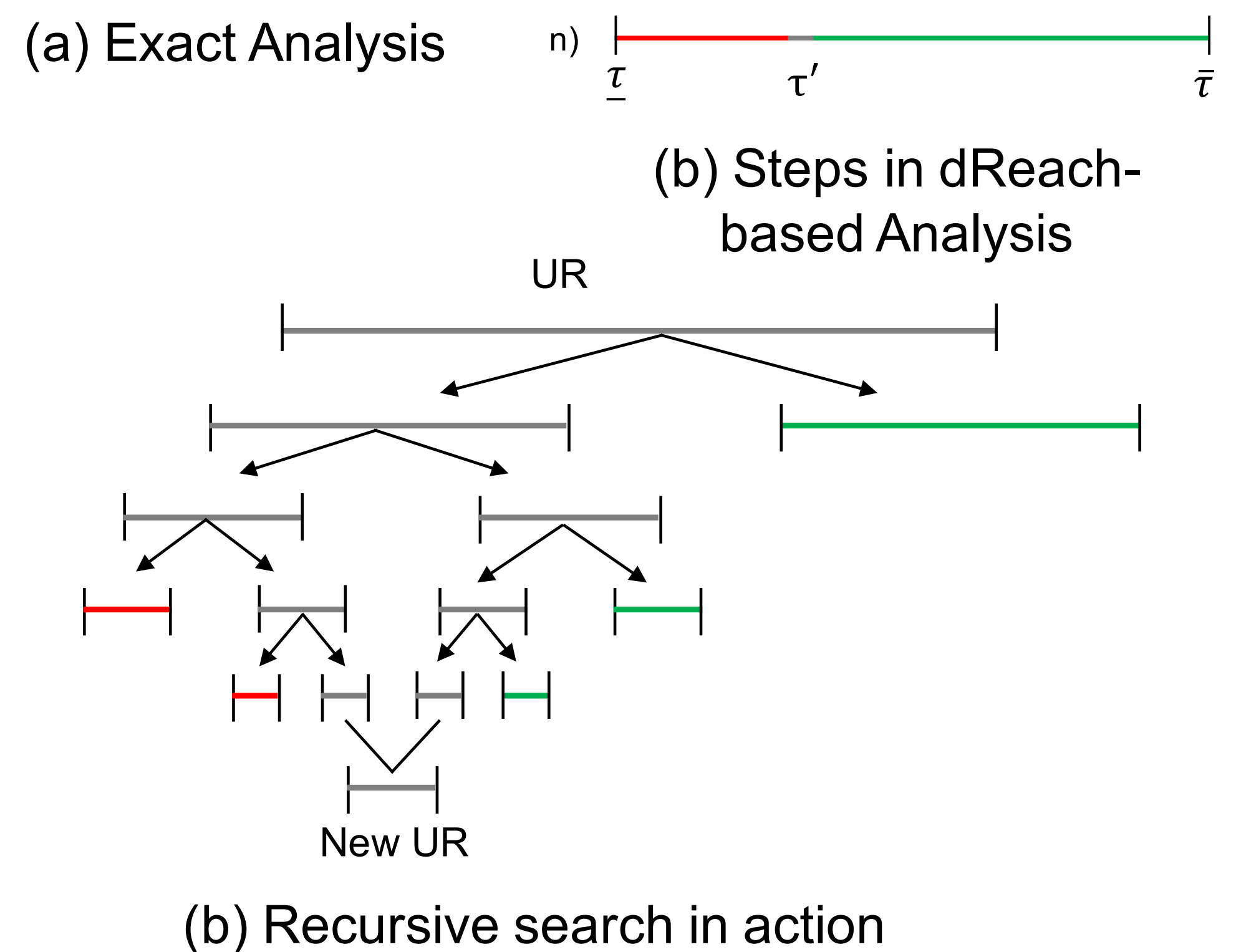
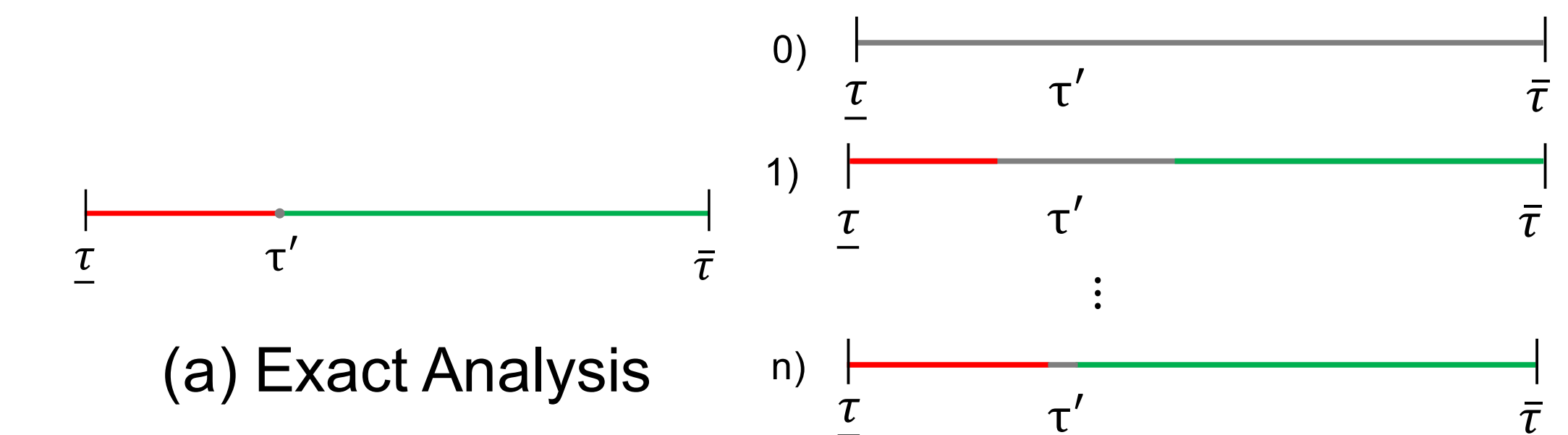


## PRODUCT AUTOMATON FOR NON-ALTERNANS: $H_N$



## BIFURCATION ANALYSIS USING $\delta$ -DECIDABILITY

- Parameter ( $\tau$ ) Synthesis problem on  $H_A$  and  $H_N$ :
  - Augment both HA with  $\dot{\tau} = 0$ , where parameter range,  $R_\tau = [\underline{\tau}, \bar{\tau}]$
  - Subrange  $S_\tau \subseteq R_\tau$  produces alternans (non-alternans), if  $\forall \tau \in S_\tau$ , goal state of  $H_N$  ( $H_A$ ) is not reachable
- Bifurcation Analysis using dReach:
  - Can not compute exact BPs (**Undecidable problem**)
  - Instead, by applying a recursive search procedure and refining  $\delta$  on dReach, computes small intervals (URs) such that each one contains a BP. Additionally, it computes alternans (AR) and non-alternans (NR) regions
  - In search procedure, parameter synthesis problem is solved recursively on current subrange until dReach label the subrange as AR or NR or it becomes smaller than current  $\delta$  on dReach



## REFERENCES

- C. C. Mitchell and D. G. Schaeffer. A two-current model for the dynamics of cardiac membrane. Bulletin of mathematical biology, 65(5):767–793, 2003.
- S. Kong, S. Gao, W. Chen, and E. M. Clarke. dReach:  $\delta$ -reachability analysis for hybrid systems. In Tools and Algorithms for the Construction and Analysis of Systems - 21st International Conference, TACAS, London, UK, April 11-18, 2015.
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