

Stability Analysis and Stabilization of Randomly Switched Systems

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Abstract

We present sufficient conditions for almost sure global asymptotic stability (GAS a.s.) of randomly switched systems via multiple Lyapunov-like functions. For systems possessing control inputs we present a method for designing controllers which render the closed-loop randomly switched system GAS a.s.

1. The Analysis Problem

System:

$$\dot{x} = f_\sigma(x), \quad (x(0), \sigma(0)) = (x_0, \sigma_0), \quad t \geq 0 \quad (\star)$$

- $x \in \mathbb{R}^n$, f_p vector field on \mathbb{R}^n , $f_p(0) = 0$, $p \in \mathcal{P}$ —finite index set
- switching signal σ is a \mathcal{P} -valued random process

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Global asymptotic stability almost surely (GAS a.s.):

System (\star) is **GAS a.s.** if

- $\forall \varepsilon > 0 \exists \delta > 0 : |x_0| < \delta \Rightarrow \mathbf{P}(|x(t)| < \varepsilon \forall t \geq 0) = 1$
- $\forall r, \varepsilon' > 0 \exists T > 0 : |x_0| < r \Rightarrow \mathbf{P}(|x(t)| < \varepsilon' \forall t \geq T) = 1$

Aim: Find sufficient conditions for GAS a.s. of (\star)

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Approach:

- extract properties of individual modes (via Lyapunov-like functions)
- extract statistical properties of switching signal σ
- connect the **two** sets of properties

2. Analysis Results: all modes stable

System: $\dot{x} = f_\sigma(x)$ (★)

Theorem A.[To appear: IEEE TAC] *System (★) is GAS a.s. if*

(G1) $\exists C^1$ pos def rad unbdd $V_p : \mathbb{R}^n \rightarrow \mathbb{R}_{\geq 0}$, $\exists \mu > 1, \lambda_o > 0$:

$$(V1) \quad L_{f_p} V_p(x) \leq -\lambda_o V_p(x)$$

$$(V2) \quad V_{p_1}(x) \leq \mu V_{p_2}(x)$$

$$N_\sigma(t) = \# \text{ switches on } [0, t[$$

(G2) $\exists \bar{\lambda}, \tilde{\lambda} > 0$: $\mathbf{P}(N_\sigma(t) = k) \leq e^{-\tilde{\lambda}t} (\bar{\lambda}t)^k / k! \quad \forall t, \forall k$

(G3) $\mu < (\tilde{\lambda} + \lambda_o) / \bar{\lambda}$

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Remarks:

- $\lambda_o > 0$ (no loss of generality) \Leftrightarrow every mode stable
- μ standard in deterministic results, but restrictive
- (G2) is loose description—no transition probabilities involved
- (G2) \Rightarrow statistically slow switching
- Continuous-time (π°, Q) -Markov chains satisfy (G2) with

$$\bar{\lambda} := \max_{i \in \mathcal{P}} |q_{ii}|, \quad \tilde{\lambda} := \max_{i, j \in \mathcal{P}} q_{ij}$$

3. Analysis Results: some unstable modes

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Theorem B. *System (★) is GAS a.s. if*

(H1) $\exists C^1$ pos def rad unbdd $V_p : \mathbb{R}^n \rightarrow \mathbb{R}_{\geq 0}$, $\exists \mu > 1$, $\lambda_p \in \mathbb{R}$:

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(H2) σ satisfies (for example):

(S1) $(S_i)_{i \in \mathbb{N}}$, $S_i := \tau_i - \tau_{i-1}$, is an i.i.d exponential(λ)¹ sequence

(S2) $(\sigma(\tau_i))_{i \in \mathbb{N}}$ is an i.i.d sequence, with $\mathbf{P}(\sigma(\tau_1) = p) = q_p$, $p \in \mathcal{P}$

(S3) $(S_i)_{i \in \mathbb{N}}$ is independent of $(\sigma(\tau_i))_{i \in \mathbb{N}}$

(H3) $\lambda + \lambda_p > 0$ and $\sum_{p \in \mathcal{P}} (\mu q_p / (1 + \lambda_p / \lambda)) < 1$

¹Density function $f_{S_i}(s) = \lambda e^{-\lambda s}$ if $s \geq 0$, and 0 else

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- Note:**
- λ fixed $\Rightarrow \lambda_p > -\lambda \quad \forall p$ (maximal allowable instability)
 - $\lambda_p \rightarrow -\lambda$ (greater instability) $\Rightarrow q_p \rightarrow 0$

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(H3):

- $\lambda + \lambda_p > 0$

- $\sum_{p \in \mathcal{P}} \frac{\mu q_p}{1 + \lambda_p / \lambda} < 1$

A glimpse into the proof of Theorem B:

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(H1):	(H2):	(H3):
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- (H1) $\Rightarrow V_{\sigma(\tau_\nu)}(x(\tau_\nu)) \leq \mu V_{\sigma(\tau_{\nu-1})}(x(\tau_{\nu-1})) e^{-\lambda_{\sigma(\tau_{\nu-1})} S_\nu}$ a.s.

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- **Iterate** to get: $V_{\sigma(\tau_\nu)}(x(\tau_\nu)) \leq V_{\sigma_0}(x_0) \mu^\nu \prod_{i=0}^{\nu-1} e^{-\lambda_{\sigma(\tau_i)} S_{i+1}}$ a.s.

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- Take expectations

$$\mathbb{E}[V_{\sigma(\tau_\nu)}(x(\tau_\nu))] \leq V_{\sigma_0}(x_0) \mathbb{E} \left[\prod_{i=0}^{\nu-1} \mu e^{-\lambda_{\sigma(\tau_i)} S_{i+1}} \right] = V_{\sigma_0}(x_0) \prod_{i=0}^{\nu-1} \mu \mathbb{E} [e^{-\lambda_{\sigma(\tau_i)} S_{i+1}}]$$

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- $\mathbb{E} [e^{-\lambda_{\sigma(\tau_i)} S_{i+1}}] = \sum_{p \in \mathcal{P}} \int_0^\infty \lambda e^{-(\lambda_p + \lambda)v} \mathbb{P}(\sigma(\tau_i) = p) dv = \sum_{p \in \mathcal{P}} (q_p / (1 + \lambda_p/\lambda))$

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- $\mathbb{E}[V_{\sigma(\tau_\nu)}(x(\tau_\nu))] \leq V_{\sigma_0}(x_0) (\sum_{p \in \mathcal{P}} \mu q_p / (1 + \lambda_p/\lambda))^\nu \rightarrow 0$ as $\nu \rightarrow \infty$ by (H3)
- With more work GAS a.s. can be deduced from here

4. Synthesis Results

System:

$$\boxed{\dot{x} = f_{\sigma}(x) + \sum_{i=1}^m g_{\sigma,i}(x)u_i, \quad (x(0), \sigma(0)) = (x_0, \sigma_0), \quad t \geq 0} \quad (\dagger)$$

- $x \in \mathbb{R}^n$, $f_p, g_{p,i}$ vector fields on \mathbb{R}^n , $f_p(0) = g_{p,i}(0) = 0$, $p \in \mathcal{P}$ —finite index set
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Control objective: Find u s.t. (\dagger) is GAS a.s. in closed-loop

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 - control-Lyapunov-like functions
 - Artstein-Sontag universal formulae for feedback stabilization
 - reduce to analysis results
- Mode-independent ($u = k(x)$)
 - analysis results still usable since they allow unstable modes
 - search for u : some modes stabilized, others not too destabilized

5. Work in Progress + Future Directions

- Input-to-state disturbance attenuation under random switching
- Controller synthesis under partial information of σ
- Extending results to Markovian jump systems
- Detailed proofs in extended report available at:
<http://decision.csl.uiuc.edu/~liberzon/publications.html>

