Stochastic Processing Networks and SRBMs in Domains with Piecewise Smooth Boundaries





Ruth J. Williams Department of Mathematics University of California, San Diego http://www.math.ucsd.edu/~williams

### OUTLINE

 Stochastic Processing Networks
An Invariance Principle for SRBMs in Domains with Piecewise Smooth Boundary

# STOCHASTIC PROCESSING NETWORKS

#### Stochastic Processing Networks (cf. Harrison '00)



An activity consumes from certain classes, produces for certain (possibly different) classes, and uses certain servers.

### **Stochastic Processing Networks**

#### Activities are Very General



### Data Network (Roberts and Massoulie, '00)







6

#### **SPN with Simultaneous Resource Possession**



#### Diffusion Workload Cone for a 3-node Linear Network under a Fair Bandwidth Sharing Policy





#### NxN Input Queued Packet Switch: Prabhakar



### 2x2 Input Queued Packet Switch



#### Diffusion Workload Cone (2 by 2 Switch using a Maximum Weight Matching algorithm)







11

#### **SRBMs in Domains with Piecewise Smooth Boundaries**

R. J. Williams

**Department of Mathematics** 

University of California, San Diego

Joint work with Weining Kang

SRBMs in Domains with Piecewise Smooth Boundaries - p.1/14

### Outline

- (1) Data for an SRBM
- (2) Definition of an SRBM
- (3) Assumptions on Data
- (4) Invariance Principle
- (5) Applications
- (6) Open Problems

### **SRBM Data**

• G a non-empty domain in  $\mathbb{R}^d$  with piecewise smooth boundary:

 $G = \bigcap_{i \in \mathcal{I}} G_i$ , where  $\mathcal{I}$  is a finite index set and  $G_i \neq \mathbb{R}^d$  is a domain with  $C^1$  boundary,  $i \in \mathcal{I}$ .

- Denote the inward unit normal vector field on  $\partial G_i$  by  $n^i$ ,  $i \in \mathcal{I}$
- $\gamma^i$  is a uniformly Lipschitz continuous unit length vector field on  $\partial G_i, i \in \mathcal{I}$
- $\mu \in \mathbb{R}^d$ ,  $\Gamma$  is a symmetric positive definite  $d \times d$  matrix
- $\nu$  is a Borel probability measure on  $\overline{G}$

## **SRBM with data** $(G, \mu, \Gamma, \{\gamma^i\}, \nu)$

An adapted, continuous *d*-dimensional process *W* defined on some filtered probability space  $(\Omega, \mathcal{F}, \{\mathcal{F}_t\}, P)$  such that

- (i) *P*-a.s., for all  $t \ge 0$ ,  $W(t) \in \overline{G}$  and  $W(t) = W(0) + X(t) + \sum_{i \in \mathcal{I}} \int_{(0,t]} \gamma^i(W(s)) dY_i(s)$ , and under *P*, W(0) has distribution  $\nu$ ,
- (ii) under P, X is a  $(\mu, \Gamma)$ -Brownian motion starting from the origin and  $\{X(t) \mu t, \mathcal{F}_t, t \ge 0\}$  is a martingale,
- (iii) for each *i*, *Y<sub>i</sub>* is a continuous, increasing adapted, one-dimensional process starting from zero, such that *P*-a.s.,  $Y_i(t) = \int_{(0,t]} 1_{\{W(s) \in \partial G_i \cap \partial G\}} dY_i(s), t \ge 0.$

### **Assumptions on** *G*

(A1) For each  $\varepsilon \in (0, 1)$  there exists  $R(\varepsilon) > 0$  such that for each  $i \in \mathcal{I}$ ,  $x \in \partial G_i \cap \partial G$  and  $y \in \overline{G_i} \cap \overline{G}$  satisfying  $||x - y|| < R(\varepsilon)$ , we have

$$\langle n^i(x), y - x \rangle \ge -\varepsilon ||y - x||.$$

(A2)  $D(r) \rightarrow 0$  as  $r \rightarrow 0$  where

$$D(r) = \sup_{\emptyset \neq \mathcal{J} \subset \mathcal{I}} \sup \left\{ \mathsf{dist} \left( x, \bigcap_{j \in \mathcal{J}} (\partial G_j \cap \partial G) \right) : \\ \mathsf{dist}(x, (\partial G_j \cap \partial G)) \leq r, \text{ for all } j \in \mathcal{J} \right\}.$$

### **Notes**

1.  $\mathcal{I}(x) = \{i \in \mathcal{I} : x \in \partial G_i\}$  is upper semi-continuous as a function of  $x \in \partial G$ .

2. If G is bounded or convex, then (A1) holds.

3. If G is bounded or a convex polyhedron, then (A2) holds.

# Assumptions on $\{\gamma^i\}$

(A3) There is a > 0 such that for each  $x \in \partial G$ , there are convex combinations  $\gamma(x)$  of  $\gamma^i(x)$  and n(x) of  $n^i(x)$  for  $i \in \mathcal{I}(x)$  such that

(i) 
$$\langle \gamma(x), n^i(x) \rangle > a$$
 for all  $i \in \mathcal{I}(x)$ ,

(ii) 
$$\langle n(x), \gamma^i(x) \rangle > a$$
 for all  $i \in \mathcal{I}(x)$ .

### **Invariance Principle: Informally**

Assume (A1)-(A3).

A sequence of processes that satisfies suitably perturbed versions of the SRBM conditions is *C*-tight.

In addition, if uniqueness in law holds for the SRBM, then the sequence of processes converges to the SRBM.

(Formal theorem —Kang-W '07)

### **Applications: Existence**

• Under (A1)-(A3), there exists an SRBM with the data  $(G, \mu, \Gamma, \{\gamma^i\}, \nu)$ .

### **Applications:** Approximation

A process that satisfies a perturbed version of the SRBM conditions is close in distribution to the SRBM under the following condition:

 G is a convex polyhedron with minimal description. For each i ∈ I, γ<sup>i</sup> is a constant vector field and {γ<sup>i</sup>} satisfies (A3).

(Uniqueness in law of SRBMs holds by Dai-W '95)

### **Approximation Continued ...**

A process that satisfies a perturbed version of the SRBM conditions is close in distribution to the SRBM under the following condition:

 G is a bounded domain with piecewise smooth boundary. The vector fields γ<sup>i</sup>, i ∈ I are continuously differentiable with locally Lipschitz first partial derivatives and there is a ∈ (0,1) such that for each x ∈ ∂G there are non-negative (b<sub>i</sub>(x) : i ∈ I(x)) such that ∑<sub>i∈I(x)</sub> b<sub>i</sub>(x) = 1 and for each i ∈ I(x):

$$b_i(x)\langle n^i(x), \gamma^i(x)\rangle \ge a + \sum_{j\in\mathcal{I}(x)\setminus\{i\}} b_j(x)|\langle n^j(x), \gamma^i(x)\rangle|.$$

(Pathwise uniqueness of SRBM holds by Dupuis-Ishii '93)

### **Invariance Principle: Hypotheses**

Suppose that  $\{\delta^n\}_{n=1}^{\infty}$  is a sequence of positive constants, and for each positive integer n, d-dimensional processes  $W^n, X^n, \alpha^n$ , and I-dimensional processes  $Y^n, \beta^n$  are all defined on some probability space  $(\Omega^n, \mathcal{F}^n, P^n)$  such that

(i) for 
$$\widetilde{W}^n \equiv W^n + \alpha^n$$
,  $P^n$ -a.s.,  
dist  $\left(\widetilde{W}^n(t), \overline{G}\right) \leq \delta^n$  for all  $t \geq 0$ ,

- (ii)  $P^n$ -a.s.,  $W^n(t) = X^n(t) + \sum_{i \in \mathcal{I}} \int_{(0,t]} \gamma^{i,n}(W^n(s-), W^n(s)) dY_i^n(s)$ for all  $t \ge 0$ , where  $\gamma^{i,n} : \mathbb{R}^d \to \mathbb{R}^d$  is Borel measurable and  $||\gamma^{i,n}(y, x)|| = 1$  for all  $y, x \in \mathbb{R}^d$  and each  $i \in \mathcal{I}$ ,
- (iii)  $X^n$  converges in distribution as  $n \to \infty$  to a  $(\mu, \Gamma)$ -Brownian motion with initial distribution  $\nu$ ,

### **Hypotheses Continued ...**

- (iv)  $\beta^n$  is locally of bounded variation and for  $\widetilde{Y}^n \equiv Y^n + \beta^n$ ,  $P^n$ -a.s., for each  $i \in \mathcal{I}$ ,
  - (a)  $\widetilde{Y}_{i}^{n}(0) = 0,$
  - (b)  $\widetilde{Y}_i^n$  is increasing and  $\Delta \widetilde{Y}_i^n(t) \leq \delta^n$  for all t > 0,

(c) 
$$\widetilde{Y}_{i}^{n}(t) = \int_{(0,t]} 1_{\{\operatorname{dist}(\widetilde{W}^{n}(s), \partial G_{i} \cap \partial G) \leq \delta^{n}\}} d\widetilde{Y}_{i}^{n}(s) \ \forall \ t \geq 0,$$

- (v)  $\delta^n \to 0$  as  $n \to \infty$ , and for each  $\varepsilon > 0$ , there is  $\eta_{\varepsilon} > 0$  and  $n_{\varepsilon} > 0$  such that for each  $i \in \mathcal{I}$ ,  $\|\gamma^{i,n}(y,x) \gamma^i(x)\| < \varepsilon$  whenever  $\|x y\| < \eta_{\varepsilon}$  and  $n \ge n_{\varepsilon}$ ,
- (vi)  $\alpha^n \to 0$  and  $\mathcal{V}(\beta^n) \to 0$  in probability as  $n \to \infty$ , where for each  $t \ge 0$ ,  $\mathcal{V}(\beta^n)(t)$  is the total variation of  $\beta^n$  on [0, t].

### **Invariance Principle (Kang-W '07)**

Define  $\mathcal{Z}^n = (W^n, X^n, Y^n)$  for each n. The sequence of processes  $\{\mathcal{Z}^n\}_{n=1}^{\infty}$  is C-tight. Any (weak) limit point of this sequence is of the form  $\mathcal{Z} = (W, X, Y)$  where all properties of the SRBM Definition hold, except possibly the martingale property, with  $\mathcal{F}_t = \sigma\{\mathcal{Z}(s): 0 \le s \le t\}, t \ge 0$ .

Furthermore, if the following conditions (vii) and (viii) hold, then  $W^n \Rightarrow W$  as  $n \to \infty$  where W is an SRBM.

(vii) For each (weak) limit point  $\mathcal{Z} = (W, X, Y)$  of  $\{\mathcal{Z}^n\}_{n=1}^{\infty}$ ,  $\{X(t) - \mu t, \mathcal{F}_t, t \ge 0\}$  is a martingale.

(viii) If a process W satisfies the SRBM Definition, then the law of W is unique.

#### Diffusion Workload Cone for a 3-node Linear Network under a Fair Bandwidth Sharing Policy





#### Diffusion Workload Cone (2 by 2 Switch using a Maximum Weight Matching algorithm)







14

### **Open Problems**

- More general sufficient conditions for (weak) uniqueness of SRBMs
- Treatment of domains with cusp-like boundary interfaces
- Treatment of domains with smooth meetings of boundaries

#### Diffusion Workload Cone for a 3-node Linear Network under another Fair Bandwidth Sharing Policy



Stochastic Processing Networks and SRBMs

#### **Diffusion Workload Cone**

#### (2 by 2 Switch using another Maximum Weight Matching algorithm)





#### Cross-section