Reflected Brownian Motions, Dirichlet Processes and Queueing Networks

K. Ramanan (Carnegie Mellon University)

includes joint work with Weining Kang and Martin Reiman

Some Early Influential Papers

M. Harrison. The diffusion approximation for tandem queues in heavy traffic. Adv. Appl. Probab., 10 (1978), 886–905.

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- M. Harrison and R. Williams Multidimensional reflected Brownian motions having exponential stationary distributions. *Ann. Probab.*, 15 (1987) 115–137.
- M. Harrison and R. Williams Brownian models of open queueing networks with homogeneous customer populations. *Stochastics*, 22 (1987) 77-115.

Reflected Processes – what are they?



G is the closure of some connected domain in \mathbb{R}^n $d(\cdot)$ is a vector field specified on the boundary ∂G d(x) is a cone for every $x \in \partial G$, graph of $d(\cdot)$ is closed ϕ satisfies some specified interior dynamics Want $\phi(t) \in G$ for all $t \in [0, \infty)$

•
$$\phi(t) = \psi(t) + \eta(t) \in G$$







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• $|\eta|(t) < \infty$ for every $t \in [0, \infty)$
• $|\eta|(t) = \int_0^\infty \mathbb{I}_{\{\phi(s) \in \partial G\}} d|\eta|(s)$
i.e., total variation $|\eta|$ increases
only when ϕ lies in ∂G
• $\eta(t) = \int_0^t \gamma(s) d|\eta|(s)$, with $\gamma(s) \in d(\phi(s)) d|\eta|$ a.e.

Given $(G, d(\cdot))$, for any continuous ψ , find a continuous ϕ such that

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Note: If X is a martingale, then $Z = \Gamma(X)$ is a semimartingale.

semimartingale = local martingale + bounded variation

General Framework

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 Rigorously shown that diffusion limits of open single-class
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Peterson ('91) established diffusion approximations of multiclass feedforward networks; associated Γ is continuous
 All multi-class queueing networks need not be modelled by Γ that are continuous

Semimartingale Reflected Brownian Motions (SRBM)

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- But *R* completely-*S* does not guarantee uniqueness;
- Completely-S condition is necessary and sufficient for existence and uniqueness (in distribution) of SRBM (Reiman-Williams '88, Taylor-Williams)

The Bramson-Williams Framework ('98) State Space Collapse + Completely-S \downarrow Heavy traffic limit theorem for the multi-class queueing network

Example 1: Generalized Processor Sharing



ESP describing mapping from inputs to the queue content

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Example 1: Generalized Processor Sharing The 3-dimensional GPS Model



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Example 2: FIFO Tandem Queue with Deadlines (Reed)



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Submartingale Formulation vs. Skorokhod Problem Approach

| | Skorokhod Problem | Submartingale Problem |
|------|--|--|
| Pros | Constructs strong solutions; yields pathwise uniqueness | Can be used to analyze arbitrary processes |
| Cons | Can only be used to analyze semimartingales | Provides only weak existence and uniqueness |

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Theorem (R. '00, '06)

- If (ϕ, η) solve the SP for ψ , then (ϕ, η) solve the ESP for ψ
- If (ϕ, η) solve the ESP for ψ and $|\eta|(t) < \infty \ \forall t$, then (ϕ, η) solve the SP
- The graph of the ESM $\overline{\Gamma}$ is closed.

Theorem ('R '06 and Kang-'R '08) The reflected diffusion *Z* associated with the GPS ESP is a

semimartingale on the interval $[0, \tau_0]$, where

$$\tau_0 = \inf\{t \ge 0 : Z(t) = 0\}$$

but Z is not a semimartingale on $[0,\infty)$

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2-d + BM case: follows from Williams ('85)

Definition

A process Z is a Dirichlet process if it admits the decomposition

Z = M + A

M local martingale and *A* a continuous process with A(0) = 0 that has zero quadratic variation,

i.e., for any sequence of partitions $\{\Pi^n\}$ of [0, t],

$$\lim_{n o\infty}|\Pi^n| o 0 \quad \Rightarrow \quad \sum_{t_i\in\Pi^n}|{\sf A}(t_{i+1})-{\sf A}(t_i)|^2\stackrel{(\mathbb{P})}{ o} 0.$$

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Note:

If *A* is a process of a.s. finite variation on bounded intervals, *Z* is a continuous semimartingales.

Given $(G, d(\cdot))$, b, σ Lip. cont and σ uniformly elliptic. Suppose there exists a Markov, weak solution (Z, B), \mathcal{F}_t to the associated SDER and let Y = Z - X:

$$X(t) = z + \int_0^t b(Z(s)) \, ds + \int_0^t \sigma(Z(s)) \, dB(s).$$

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Theorem W. Kang and 'R, ('08)

If there exist $p \ge 2$ and $q \ge 2$ such that for every $0 \le s, t \le T$,

$$\mathbb{E}\left[|Y(t) - Y(s)|^{p}|\mathcal{F}_{s}
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In particular, this holds when the ESM is Hölder continuous or if the directions satisfy the so-called generalized completely-S condition.

$$Z(t)=Z(0)+B(t)+Y(t).$$

B standard Brownian motion, *Y* is the regulating process Need to show

$$\sum_{t_i\in\Pi^n}|Y(t_i)-Y(t_{i-1})|^p\stackrel{\mathbb{P}}{
ightarrow}0,\qquad as||\Pi^n||
ightarrow 0.$$

Define

$$\zeta^m = \inf\{t > 0 : |Z(t)| \ge m\}.$$

By localization suffices to show that

$$\sum_{t_i\in\Pi^n}|\, \mathsf{Y}(t_i\wedge\zeta^m)-\,\mathsf{Y}(t_{i-1}\wedge\zeta^m)|^{oldsymbol{
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Sketch of the Proof (contd.)



- control *p*-variation on $[\tau_i, \sigma_i)$ using semimartingale property away from origin; show summable;
- obtain estimates on *p*-variation on $[\sigma_i, \tau_{i+1})$ in terms of time spent in $\varepsilon/2$ -nbhd of 0; show it disappears, on sending $\varepsilon \to 0$, by instantaneous reflection property

Properties of the GPS ESP

Theorem (R '06, Dupuis-'R '98) The GPS ESM is Lipschitz continuous

Proof Involves Constructing an Associated Norm;



Combines convex duality and algebra; vertices of *B* form the root system for the Lie albegra A_{n-1} of the Lie group $s\ell_n$

Revisiting the GPS Model



Order sources so that

$$\frac{\lambda_1}{\alpha_1} \geq \frac{\lambda_2}{\alpha_2} \geq \ldots \geq \frac{\lambda_N}{\alpha_N},$$

and define

$$J \doteq \max\left\{j \le N : \frac{\lambda_j}{\alpha_j} = \frac{\lambda_1}{\alpha_1}\right\}$$

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A Heavy Traffic Limit Theorem for the GPS Model

Theorem

(R.-Reiman '03, R.-Reiman '06) Suppose the heavy traffic condition holds:

$$\sum_{j=1}^J \lambda_j = \sum_{j=1}^J \alpha_j = 1.$$

The appropriately scaled workload process in the GPS model converges weakly to the pathwise unique solution of a reflected diffusion in \mathbb{R}^J_+ associated with the GPS ESP with weights

$$\tilde{\alpha}_i = \frac{\alpha_i}{\sum_{i \le J} \alpha_i}.$$

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Lies outside the Bramson+Williams and cont. mapping frameworks

References

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