### **Discussion of**

# Adaptive Markov Chain Monte Carlo Algorithms

### by Jeff Rosenthal

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Adapt'Ski III

Virtual trip in time and space

space = statistical journals

### **Bayesian Analysis**

- 2008 Computational Methods for Parameter Estimation in Climate Models. A. Villagran, G. Huerta, C.S. Jackson, M.K. Sen
- 2009 Bayesian Analysis for Emerging Infectious Diseases. C.P. Jewell, T. Kypraios, P. Neal, G.O. Roberts
- 2010 Model Selection and Adaptive MCMC for Bayesian Cointegrated VAR Models.
  G.W. Peters, B. Kannan, B. Lasscock, C. Mellen
  - Evolutionary Stochastic Search for Bayesian Model Exploration (genomics)
     L. Bottolo and S. Richardson
  - A General Purpose Sampling Algorithm for Continuous Distributions (the t-walk)
     J.A. Christen and C. Fox

### **Bayesian Analysis**

- 2007 Re-considering the variance parameterization in multiple precision models
   Y.H. James, S. Hodgesy, and B.P. Carlin
- 2006 A comparison of Bayesian and likelihoodbased methods for fitting multilevel models
   W.J. Browne and D. Draper

# OLD FASHION ADAPTATION

### • finite horizon adaptation

Tierney + Mira, 1999, Some adaptive MC methods for Bayesian inference

#### independent adaptation

Roberts + R 2007, Coupling and Ergodicity of Adaptive MCMC  $\Gamma_n$  independent from  $X_n$  as in systematic and random scan hybrid algorithms

#### regeneration time

Gilks + Roberts + Sahu, 1998, Adaptive Markov Chain Monte Carlo

# ADAPTIVE REJECTION SAMPLING

- 2009, Bayesian Generalized Method of Moments, G. Yin
- 2007, Bayesian Hierarchical Multiresolution Hazard Model, V. Dukic
- 2006, Explaining Species Distribution Patterns through Hierarchical Modeling,
   A.E. Gelfand, J.A. Silander, S. Wu, A. Latimer, P.O. Lewis, A. G. Rebelo, M. Holder
- 2006, Bayesian Auxiliary Variable Models for Binary and Multinomial Regression, C.C. Holmes and L. Held

**Google Scholar**: 15 entries total for "adaptive MCMC" and "adaptive Metropolis"

### Other journals

# • JRSS B

**2010**, Particle MCMC methods, C. Andrieu, A. Doucet and R. Holenstein

2004, Markov chain Monte Carlo methods for high dimensional inversion in remote sensing, H. Haario, M. Laine, M. Lehtinen, E. Saksman, J. Tamminen

### • JASA

**2009**, Learn From Thy Neighbor: Parallel-Chain and Regional Adaptive MCMC R.V. Craiu, J. Rosenthal, C. Yang

+ book reviews

# • JCGS

**2010**, Divide and Conquer: A Mixture-Based Approach to Regional Adaptation for MCMC, Y. Bai, R. Craiu, A. Di Narzo

**2009**, Examples of Adaptive MCMC, G. Roberts, J. Rosenthal

**2005**, Identification of Regeneration Times in MCMC Simulation, With Application to Adaptive Schemes, A. Brockwell , J. Kadane

# • Computational Statistics

**2006**, Semiparametric estimation of mean and variance functions for non-Gaussian data, D. Nott

**2005**, Componentwise adaptation for high dimensional MCMC, H. Haario, E. Saksman and J. Tamminen

# • Statistics and Computing

**2010**, A computational framework for empirical Bayes inference, Y. Atchadé

**2008**, Special issue on adaptive Monte Carlo methods, P. Fearnhead

**2008**, Adaptive independence samplers, J. Keith, D. Kroese, G. Sofronov

**2008**, Adaptive evolutionary MC for optimization with applications to sensor placement problems, Y. Ren, Y. Ding, F. Liang

**2008**, A tutorial on adaptive MCMC, C. Andrieu and J. Thoms

**2006**, DRAM: Efficient adaptive MCMC, H. Haario, M. Laine, A. Mira, E. Saksman

Bernoulli
 2005 and 2009 by Y. Atchadé

# QUESTIONS

- How to compare alternative adaptive and non-adaptive MCMC algorithms?
   (I)ACT, Avr. sq. jump dist., Suboptimality factor, Number of target evaluations, Simulation time ... ?
- How to compare alternative adaptive MCMC, population MC and importance sampling?
- Latest news on CLT and SLLN for adaptive schemes?
  all the statement you made in the presentations are in terms of "convergence in probability" plus Γ<sub>n</sub> is not even guaranteed to converge

- any update on simultaneous adaptation of two parallel chains  $X'_n$  and  $X_n$  where  $\Gamma_n$  looks at  $X'_n$  only
- Are the two open questions of R+R 2007 still open?
   Any new open problems for the decade?
   Any prize?!?