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Books

The first nine items are books, with two having thoroughly revised second editions. Only a few conference papers, containing worthwhile material not published elsewhere, are included.

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Research Description for Harold Kushner

Stochastic dynamical systems, whether controlled or uncontrolled, are ubiquitous in applications.

In the mid-1960s, Kushner established much of the basic theory of stochastic stability, based on the concept of supermartingales as Lyapunov functions. Extension to non-Markovian and infinite-dimensional systems followed, and he developed a full stochastic analog of the LaSalle invariance theorem, which is essential for application to distributed and delay systems. Such results, which are analogous to the theory for deterministic systems, are essential for the analysis of the long-term behavior of complex stochastic systems arising in control, economics, recursive algorithms, and elsewhere. Because proof of stability is often required before any further analysis can be done, these have been fundamental tools for the analysis of stochastic systems ever since. It was Kushner who, in the mid- 1960s, provided the first rigorous development of nonlinear filters for diffusion-type processes with white observation noise. This is the analog of Kalman filtering for nonlinear systems, and concerns the tracking of systems with nonlinear dynamics or observations. He also developed many practical algorithms for approximating optimal filters, adaptations of the theory for dealing with robustness and for systems that are only "approximately" Markovian or have only wideband width noise, as well as extensions to distributed systems.

Numerical methods for problems arising in stochastic control have always been a challenge. The optimal value function formally solves the Bellman-Hamilton-Jacobi equation. Even when the derivation is formally justified, the equation can be a highly nonlinear (even in the highest-order terms) elliptic or parabolic partial differential equation, an integral-differential equation, or a variational inequality. The equations tend to be degenerate and to have serious singularities; moreover, the reflections on the boundaries are often not continuous. The solutions, even when they are known to exist, might not be differentiable or even continuous. Generally, there is little theory concerning regularity or even existence. So the use of classical numerical methods can be problematic. Kushner's Markov chain approximation method is the current approach of choice for such problems. The algorithms are robust; they are intuitively reasonable and have physical meaning because the approximating Markov chains represent systems similar to the one being approximated. The convergence theory is purely probabilistic, using methods of stochastic control, so that the analytical difficulties are avoided. Kushner is the author of ten books and more than two hundred papers. In his 1984 book he developed a comprehensive approach to

approximation and weak convergence methods for random processes, with emphasis on problems that arise in control and communications, e.g., systems driven by wide-band noise, perhaps appearing nonlinearly in the dynamics. The original physical models are often not Markovian; but for purposes of analysis or numerical approximation, approximation by a Markovian model is important. The book presents powerful methods for obtaining such approximations, as well as for proving stability of the original physical systems. The ideas are widely used in the analysis of stochastic recursive algorithms, for the approximation of stochastic networks under general conditions, and for obtaining "nearly optimal" controls for 20 systems driven by wide-bandwidth noise; recently, they have been applied to the development of scheduling algorithms for mobile communications with rapidly varying connecting channels.

His 1990 book sets out a complete theory of singularly perturbed stochastic control systems and nonlinear filters, with multiple time scales and white or wide-band noise processes. Most recently, his 2001 book presents a thorough development of the theory of heavy traffic analysis of both controlled and uncontrolled queuing and communications systems.

With his work in stochastic approximation and recursive stochastic algorithms, Kushner put in place a large part of the current framework. The theory concerns the analysis of the asymptotic properties of the paths of a large class of stochastic difference equations. Such equations model a large number of adaptive processes in control and communications, learning in neural networks, market-adjustment algorithms in economics, and processes in other settings. They are ubiquitous in current applications. Kushner established powerful methods for the analysis of convergence and rate of convergence under very weak conditions on the noise and dynamics.