



# Business Analytics

Methods, Models, and Decisions

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THIRD EDITION  
GLOBAL EDITION



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**Online Supplements:** Information about how to access and use Analytic Solver Basic are available for download at [www.pearsonglobaleditions.com](http://www.pearsonglobaleditions.com).

Getting Started with Analytic Solver
Using Advanced Regression Techniques in Analytic Solver
Using Forecasting Techniques in Analytic Solver
Using Data Mining in Analytic Solver
Model Analysis in Analytic Solver
Using Monte Carlo Simulation in Analytic Solver
Using Linear Optimization in Analytic Solver
Using Integer and Nonlinear Optimization in Analytic Solver
Using Optimization Parameter Analysis in Analytic Solver
Using Decision Trees in Analytic Solver

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