## contents

3 Note from the Editor in memoriam: J. Scott Armstrong (1937-2023) 5 Iconoclast and Champion of Science for Practical Purposes Kesten Green Lessons from a Mentor and Friend Andreas Graefe 9 Scott Armstrong's Scientific Legacy Arch Woodside forecast evaluation Malte Tichy **10** The Forecaster's Evaluation Dilemma ijf research **15** Combining Probability Predictions Ville A. Satopää forecast modeling **21** Estimating Predictive Probability of Success Shaun Comfort Accuracy vs. Runtime with Multiple Seasonalities Stephan Kolassa tutorial 35 Linear Regression with a Time Series View Ken Fordyce Part 1: Simple Linear Regression public policy **40** How Well Can Social Scientists Forecast Societal Change? Igor Grossmann, Christoph Bergmeir & Peter Slattery special feature: decision intelligence 47 A Case for a More Decision-centric IBP Niels van Hove How Decision Intelligence Integrates Forecasting, AI, Lorien Pratt, David Roberts, Nadine Malcolm, Brian Fisher, and Data into Complex Decisions Katie Barnhill, Daniela Jones book reviews & Michael Kudenov 58 Sales & Operations Planning – An Executive Update by Robert A. Stahl Patrick Bower **60** *Power and Prediction: The Disruptive Economics of Artificial* Ira Sohn Intelligence by Ajay Agrawal, Joshua Gans, and Avi Goldfarb **64** *Demand Forecasting for Executives and Professionals* Simon Spavound by Stephan Kolassa, Bahman Rostami-Tabar, and Enno Siemsen spotlights **66** Sevvandi Kandanaarachchi **68** Ruben Crevits opinion-editorial Charles Chase & **69** In Pursuit of Consumption-Based Forecasting Kenneth Kahn

# FORESIGHT

Foresight Advisory Board Chairman: Jim Hoover, University of Florida

Carolyn Allmon, Teleflex Inc.

Ellen Bonnell, Analytics Consultant

Charles Chase, SAS

Mark Chockalingam, Valtitude/Demand Planning LLC

Ruben Crevits, OMP

**Robert Fildes**, Lancaster Centre for Forecasting

Ram Ganeshan, College of William and Mary

**Igor Gusakov**, GoodsForecast

Sevvandi Kandanaarachchi, CSIRO

Jonathon Karelse, NorthFind Management

Joe McConnell, McConnell Chase Software

Polly Mitchell-Guthrie, Kinaxis

Steve Morlidge, CatchBull Ltd.

Dilek Önkal, Northumbria University

John Pope, Investment Economics

Johann Robette, Vekia

Christian Schäfer,

Cooperative State University of Baden-Württemberg

Jerry Shan, LinkedIn

Sujit Singh, Arkieva

Marina Sologubova, Estée Lauder

Eric Stellwagen, Business Forecast Systems

Nicolas Vandeput, SupChains

Lawrence Vanston, Technology Futures

IIF Membership & Subscriptions Pam Stroud, IIF Business Director forecasters@forecasters.org

Foresight is published by the International Institute of Forecasters, with the purpose of advancing the practice of forecasting. We encourage submissions from industry practitioners, software and consulting vendors, and academic researchers. Manuscripts should be written in language accessible to analysts, planners, managers, and students. All manuscripts are peer reviewed and edited for clarity and style.

See the Guidelines for Authors (page 80) for full details on suitable topics, manuscript preparation, and manuscript submission.

Foresight welcomes advertising. However, journal content is solely at the discretion of the editors and will adhere to the highest standards of objectivity. Where an article describes the use of commercially available software or a licensed procedure, the author must disclose any interest in the product. Articles whose principal purpose is to promote a commercial product or service will be rejected.

©2024 International Institute of Forecasters (ISSN 1555-9068)

Editor-in-Chief

**Deputy Editor** 

**Associate Editors** 

Column Editors

Michael Gilliland

Stephan Kolassa

Simon Clarke

**Fotios Petropoulos** 

**Aris Syntetos** 

Shari De Baets

Judgmental Forecasting

**Jeff Baker** 

Forecasting Practice

**Patrick Bower** 

Practitioner's Corner

**Elaine Deschamps** 

Government & Public Policy

**Anne-Flore Elard** 

Support Systems

**Paul Goodwin** 

Hot New Research

**Tao Hong** 

Energy & Environment

Niels van Hove

Decision Intelligence

**Malvina Marchese** 

Financial Forecasting

Ira Sohn

Long-range Forecasting

**Evangelos Spiliotis** 

Machine Learning & AI

Foresight Staff

Pam Stroud

Marketing & Sponsorship

Liza Woodruff

Design & Production

Ralph Culver

Manuscript Editor

**Mary Ellen Bridge** 

Copy Editor

**Holly Lancaster** 

Marketing & Communications

Foresight Business Office: 53 Tesla Avenue Medford, MA 02155 USA

## note from the editor

#### FORESIGHT STAFFING CHANGES



Sharing a laugh with Bill Tonetti, IBF New Orleans, 2007

ur appreciation to Bill Tonetti, who is stepping down from the Foresight Advisory Board after serving since our first issue in 2005. Through his presence at Demand Works and more recently at Netstock, Bill has been an ongoing supporter of Foresight's mission and a valuable contributor to the FAB. Thank you, Bill!

Filling Bill's spot on the FAB is Ruben Crevits, Lead Data Scientist

at OMP in Belgium, and subject of one of this issue's Spotlight interviews.

Congratulations to Jeff Baker of Libra SCM, as he moves from the FAB to Column Editor

for Forecasting Practice. Since his first article in 2021, Jeff has become a regular contributor to Foresight and a Practitioner Track speaker at the ISF. He is taking over for Stefan de Kok, who served in the CE role since 2021 and will remain as a frequent contributor (having authored three articles in 2023 with more to come in 2024).



**Ieff Baker** 

### TRIBUTES TO J. SCOTT ARMSTRONG (1937-2023)

On September 28 we lost a founder of the International Institute of Forecasters and one of the giants in our field, J. Scott Armstrong. We begin this issue with Scott's longtime collaborators Kesten Green and Andreas Graefe detailing Scott's career and broad contributions, as well as his generosity as a mentor and friend. Arch Woodside concludes our tributes with a summary of Scott's scientific legacy.

#### PREVIEW OF FORESIGHT ISSUE 72

On the topic of Forecast Evaluation, **Malte Tichy** argues that flawed evaluation procedures create an incentive to provide dishonest forecasts. His article describes how to address this Forecaster's Evaluation Dilemma.

In our Modeling section, **Ville Satopää** shows the ways of combining probabilistic predictions, by pulling the key takeaways from his research published in the International Journal of Forecasting. Then **Shaun Comfort**, one of the rare MDs to publish in *Foresight*, shares a Bayesian approach for estimating the predictive probability of success. **Stephan Kolassa** completes the section by looking at the various methods for handling multiple seasonality, and considers the accuracy vs. runtime trade-off.

The Tutorial section begins a two-part series by **Ken Fordyce** on linear regression from a time series viewpoint. In this issue, Ken covers simple linear regression, with multiple regression to be dealt with in Q2.

Our Public Policy section examines how well social scientists can forecast societal change. Igor Grossmann, Christoph Bergmeir, and Peter Slattery summarize their results from large-scale studies and a major forecasting competition.

Niels van Hove, our Column Editor for Decision Intelligence, has organized a special feature starting with his own article on decision-centric IBP. Then Lorien Pratt and colleagues illustrate the prominent role forecasters can play in contributing to decision intelligence by introducing the Causal Decision Diagram.

We have three Book Reviews:

- Patrick Bower on Robert Stahl's Sales & Operations Planning An Executive Update
- **Ira Sohn** on Ajay Agrawal, Joshua Gans, and Avi Goldfarb's *Power and Prediction: The Disruptive Economics of Artificial Intelligence*
- **Simon Spavound** on Stephan Kolassa, Bahman Rostami-Tabar, and Enno Siemsen's *Demand Fore-* casting for Executives and Professionals

Our Spotlight features two of our newest *Foresight* Advisory Board members:

- Sevvandi Kandanaarachchi of CSIRO in Australia
- Ruben Crevits of OMP in Belgium

And in our sole Opinion-Editorial this issue, **Charlie Chase** of SAS and **Ken Kahn** of Old Dominion University make an appeal for the use of consumption-based forecasting.

### CALL FOR PAPERS – SPECIAL FEATURE ON FORECASTING FOR THE CIRCULAR ECONOMY

In 2024 Foresight will be publishing a special feature section on "Forecasting for the Circular Economy." We welcome articles and commentaries on this topic. The circular economy involves strategies such as repair, remanufacturing, and recycling – all aimed at minimizing reliance on increasingly scarce resources. Proper management of the circular economy requires supplementary forecasts of the reverse "loop" (forecasts of return rates and condition) to drive scheduling and replenishment, and other decisions. For an example, see the Foresight article "Forecasting for Remanufacturing" (Goltsos and Syntetos, Issue 56, 10-17).

Questions should be directed to the section organizers, Aris Syntetos (syntetosa@cardiff.ac.uk) and Thanos Goltsos (goltsosa@cardiff.ac.uk). Manuscript submissions are due July 1, 2024.

#### CALL FOR PAPERS – THE INTERNATIONAL SYMPOSIUM ON FORECASTING

The 2024 ISF will be held in Dijon, France, June 30 - July 3 (isf.forecasters.org). Abstract submissions are now being accepted for both Regular and Invited tracks. Submissions are due by March 22, with notification of acceptance/rejection on April 2.



— Mike Gilliland Dragonfly Farm Seagrove, NC USA