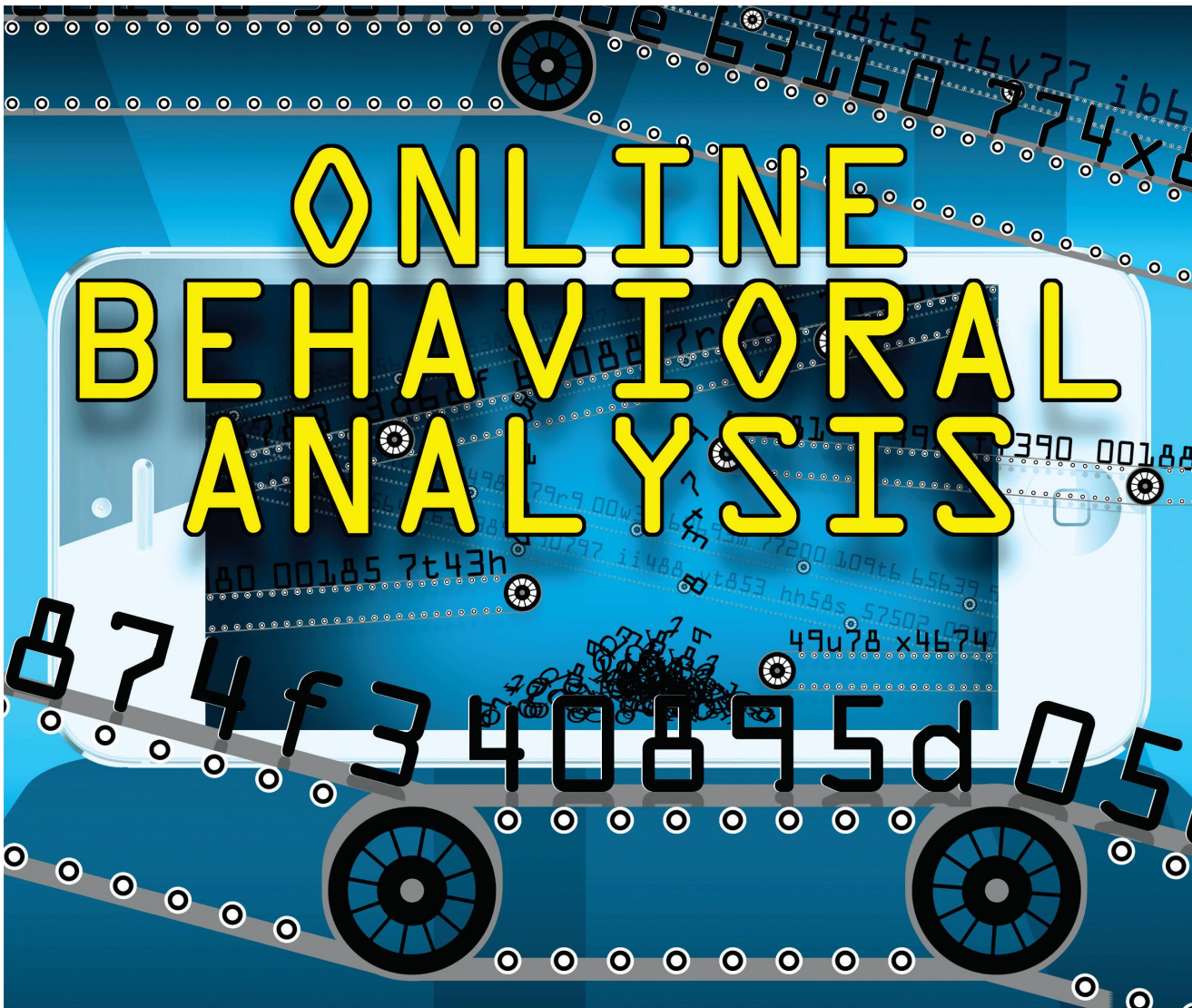


Also in this issue:

- AI's 10 to Watch **56**
- Real-Time Taxi Dispatching **68**
- From Flu Trends to Cybersecurity **84**

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Contents

JANUARY/FEBRUARY 2016

Volume 31, Number 1

IEEE Intelligent Systems provides peer-reviewed, cutting-edge articles on the theory and application of systems that perceive, reason, learn, and act intelligently.

ARTICLES

Online Behavioral Analysis and Modeling

2 Guest Editors' Introduction

Peng Cui, Huan Liu, Charu Aggarwal, and Fei Wang

5 Topic-Aware Physical Activity Propagation in a Health Social Network

Nhathai Phan, Javid Ebrahimi, Dave Kil, Brigitte Piniewski, and Dejing Dou

15 Point-of-Interest Recommendations via a Supervised Random Walk Algorithm

Guandong Xu, Bin Fu, and Yanhui Gu

24 Trust Agent-Based Behavior Induction in Social Networks

Lei Li, Jianping He, Meng Wang, and Xindong Wu

31 Suspicious Behavior Detection: Current Trends and Future Directions

Meng Jiang, Peng Cui, and Christos Faloutsos

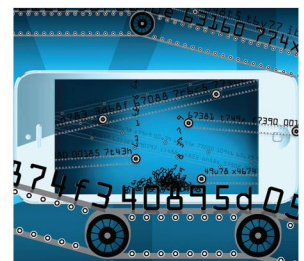
Features

41 Contextual Sentiment Topic Model for Adaptive Social Emotion Classification

Yanhui Rao

48 Experimenting with Certified Reputation in a Competitive Multi-Agent Scenario

Francesco Buccafurri, Antonello Comi, Gianluca Lax, and Domenico Rosaci



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DEPARTMENTS

56

AI's 10 to Watch

Haris Aziz
Collective Decision Making in Multi-Agent Systems

Elias Bareinboim
From Causal Inference and Data Fusion to an Automated Scientist

Yejin Choi
Language, Vision, and Social AI

Daniel Hsu
Algorithms for Machine Learning

Shivaram Kalyanakrishnan
Learning Agents

Reshef Meir
Strategy and Bounded Rationality

Suchi Saria
A Reasoning Engine for Tailoring Healthcare to the Individual

Gerardo I. Simari
Pushing the Limits of Knowledge Representation and Reasoning

Lirong Xia
Better Group Decision-Making

William Yeoh
Distributed Constraint Optimization

68

Intelligent Transportation Systems

Michal Maciejewski, Joschka Bischoff, and Kai Nagel
As Assignment-Based Approach to Efficient Real-Time City-Scale Taxi Dispatching

78

Human-Centered Computing

Robert R. Hoffman and Matthieu Branlat
To Know or Not to Know, What Is the Need?

84

Predictive Analytics

B. Aditya Prakash
Prediction Using Propagation: From Flu Trends to Cybersecurity

14 Advertiser Index

67 IEEE Computer Society Information

Circulation: IEEE Intelligent Systems (ISSN 1541-1672) is published bimonthly by the IEEE Computer Society, IEEE Headquarters, Three Park Ave., 17th Floor, New York, NY 10016-5997; IEEE Computer Society Publications Office, 10662 Los Vaqueros Circle, P.O. Box 3014, Los Alamitos, CA 90720-1314, phone +1 714 821 8380; IEEE Computer Society Headquarters, 2001 L St., Ste. 700, Washington, D.C. 20036-4910. **Subscription rates:** To subscribe to IEEE Intelligent Systems, visit www.computer.org/intelligentsystems



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