

Guest Editorial

Nutrition Informatics: From Food Monitoring to Dietary Management

NON-COMMUNICABLE DISEASES (NCD), namely diabetes mellitus, cardiovascular diseases, chronic respiratory diseases and cancer, account for a massively increasing proportion of the global health burden. A number of behavioral and physiological factors are related to the rising onset of NCD worldwide, with unhealthy eating playing a key role among them. In parallel, food allergies and associated acute and sometimes life-threatening reactions are a public health problem. Thus, balanced nutrition with a proper diet is the key to the prevention of diet related diseases.

The recent advances in smartphone technologies, wearable sensors, computer vision and machine learning will bring the applications of nutrition informatics closer to the individuals and enable them to make better decisions regarding their daily nutrition. In this special issue, five papers were accepted for publication.

In the first paper, the authors proposed a new, publically available, benchmark dataset for food recognition methods. The dataset contains images of trays from a real canteen, with multiple dishes and different servings. The foods on the tray images were manually annotated by drawing polygonal boundaries. Baseline methods for the analysis of the provided images were also presented. The pipeline takes a tray image as input, finds the regions of interest, and predicts the corresponding food class for each region. Three different approaches for recognizing the foods were investigated with several visual descriptors. The best performance was achieved with deep convolutional neural networks.

In the second paper, the authors described a study of a wrist motion monitor as a tool for detection and counting of hand-to-mouth gestures during food intake. The study investigated the sensitivity and positive predictive value of the device in a group of 271 individuals with varying demographics consuming a range of cafeteria foods varying in packaging and need of use of utensils during consumption. The wrist motion was monitored by inertial sensors in a watch-like device. The times of hand-to-mouth gestures detected by the device were compared with those established by video observation.

In the third paper, the authors suggested the use of a novel wearable device for chewing detection that combined a chewing sound sensor, an accelerometer and a photoplethysmography

sensor placed in the ear concha. The methodology first processes the signal from each of the individual sensors and then performs decision fusion to improve the overall accuracy of food intake detection. The sensor system was evaluated in both controlled and unrestricted conditions, with 14 subjects. The results suggest that the use of a multi-sensor sensor system improved the accuracy of the food intake detection.

In the fourth paper, the authors present an algorithm for meal detection and portion size estimation based on the analysis of continuous glucose monitoring (CGM) signal. A wavelet filter is applied to the CGM signal to reduce the noise level. Then, the filtered signal is transformed to a fuzzy qualitative representation, in order to define periods of time in which the meal is detected. Then a fuzzy system incrementally estimates the carbohydrate content of the meal. The algorithmic approach aims at individuals with type 1 diabetes under artificial pancreas therapy. The algorithm was extensively evaluated in a series of different experiments using the FDA accepted UVa/Padova type 1 diabetes metabolic simulator. The results indicated that the proposed approach was able to detect a meal, estimate its carbohydrate content and appropriately adjust the prandial insulin to achieve post-prandial glucose control.

In the final paper, the authors proposed the assessment of adherence to nutritional interventions. The authors argue that traditional statistics are not sufficient to detect subtle effects of nutritional interventions and thus the evaluation of adherence is generally omitted from the analysis. The paper suggests the use of Trajectory Maps as a visual tool to follow the dietary patterns during the intervention, and to evaluate the adherence to the intervention and its effects. The methodology was tested in a human study showing that some individuals adhere better than the others to the prescribed nutritional regimen and that the intervention effects are individual.

This special issue would not have been possible without the great support of the editorial team of the IEEE J BHI. The editors would like to thank the authors for their great and important manuscripts, and all the reviewers for their professional work and constructive comments. We truly hope that our effort to bring together leading technical experts resulted in a significant special issue focused on technological approaches to dietary assessment and applications of nutrition informatics for food and nutrient monitoring, diet assessment and dietary management.

S. MOUGIAKAKOU, *Guest Editor*
 University of Bern
 Bern 3008, Switzerland
 stavroula.mougiakakou@artorg.unibe.ch

K. YANAI, *Guest Editor*
 The University of Electro-Communications
 Chofu, Tokyo 182-8585, Japan
 yanai@cs.uec.ac.jp

G. M. FARINELLA, *Guest Editor*
 University of Catania
 Catania 95124, Italy
 gfarinella@dmf.unict.it

E. SAZONOV, *Guest Editor*
 University of Alabama
 Tuscaloosa, AL 35487 USA
 esazonov@eng.ua.edu



Stavroula Mougiakakou received the Diploma degree in electrical and computer engineering and the Ph.D. degree in computer engineering from the National Technical University of Athens, Athens, Greece, in 1997 and 2003, respectively. Since 2008, she has been an Assistant Professor in the Faculty of Medicine, University of Bern, Bern, Switzerland and the Head of the Diabetes Technology Research Group, ARTORG Center for Biomedical Engineering Research, Bern, Switzerland. Her current research interests include artificial intelligence, machine learning, computer vision, control algorithms, and advanced data analysis for the prevention and treatment optimization of diabetes and related chronic diseases. She has published more than 70 papers in international peer-reviewed scientific journals, book chapters, and conferences proceedings. Furthermore, she served as an Associate Editor of the IEEE TRANSACTIONS ON INFORMATION TECHNOLOGY IN BIOMEDICINE from 2011 to 2012, and as a Guest Editor in several international journals. She was, and is currently as a Session Chair, and Technical or Scientific Committee Member for international scientific conferences. She is also organizing the International Work-

shop on Multimedia Assisted Dietary Management. She has also been involved as a Coordinator or Scientific Leader in several national and international projects.



Giovanni Maria Farinella (M'11–SM'16) received the Master of Science degree (*egregia cum laude*) in computer science from the University of Catania, Catania, Italy, in 2004, and the Ph.D. degree in computer science from the University of Catania, in 2008. He is a Tenure Track Associate Professor in the Department of Mathematics and Computer Science, University of Catania. From 2008, he is a Professor of computer science for undergraduate courses at the University of Catania. From 2007, he is a Research Member of the Joint Laboratory STMicroelectronics, University of Catania. His research interests include the field of computer vision, pattern recognition, and machine learning. Since 2005, he has been scientifically involved in different public and private research projects. He is author of one book (monograph), editor of five international volumes, editor of five international journals, author or coauthor of more than 100 papers in international book chapters, international journals and international conference proceedings, and of 18 papers in national book chapters, national journals, and national conference proceedings. He is coinventor of four patents involving industrial partners. In 2006, he founded and currently

directs the International Computer Vision Summer School. In 2014, he also founded and currently directs the Medical Imaging Summer School. He serves as a Reviewer on the board programme committee for major international journals (CVIU, TIP, TMM, PR) and international conferences (CVPR, ICCV, ECCV, BMVC, ACM MM, ICIP, ICPR). He is an Associate Editor of the *Journal IET Computer Vision*. He has been an Area Chair for ICCV 2017, Video Proceedings Chair for the International Conferences ECCV 2012 and ACM MM 2013, General Chair of the International Workshop on Assistive Computer Vision and Robotics (ACVR—held in conjunction with ECCV 2014, ICCV 2015, ECCV 2016, ICCV 2017), and Chair of the International Workshop on Multimedia Assisted Dietary Management 2015/2016/2017. He has been a Speaker at different international events, as well as an Invited Lecturer at industrial institutions (STMicroelectronics, Telecom). He is a CVF/IAPR/GIRPR/AIxIA/BMVA member.



Kenji Yanai received the B.Eng., M.Eng., and D.Eng. degrees from the University of Tokyo, Tokyo, Japan, in 1995, 1997, and 2003, respectively. He is a Professor in the Department of Informatics, University of Electro-Communications, Tokyo, Japan. From 1997 to 2006, he was a Research Associate and till 2015 he was an Associate Professor in the Department of Computer Science, University of Electro-Communications. From November 2003 to September 2004, he was a Visiting Scholar in the Department of Computer Science, University of Arizona, Tucson, AZ, USA, under the supervision of Prof. Kobus Barnard. His recent research interests include object recognition, web multimedia processing, and social media mining. He served as a Doctoral Symposium Co-Chair of ACM Multimedia 2012, as a Publication Co-Chair of ISM 2013, 2014, 2015, as a Co-organizer of several workshops and special sessions including MADiMa 2015, 2016, and TPC members/reviewers in major conferences and journals in the multimedia and computer vision field. He will serve as a Program Co-chair of ACM Multimedia Retrieval 2018 as well.



Edward Sazonov (M'02–SM'11) received the Diploma degree in systems engineering from Khabarovsk State University of Technology, Khabarovsk, Russia, in 1993 and the Ph.D. degree in computer engineering from West Virginia University, Morgantown, WV, USA, in 2002. He is currently a Professor in the Department of Electrical and Computer Engineering, University of Alabama, Tuscaloosa, AL, USA, and the Head of the Computer Laboratory of Ambient and Wearable Systems (<http://claws.eng.ua.edu>). His research interests include wireless, ambient and wearable devices, and methods of biomedical signal processing, and pattern recognition. Devices developed in his laboratory include a wearable sensor for objective detection and characterization of food intake; a highly accurate physical activity and gait monitor integrated into a shoe insole; a wearable sensor system for monitoring of cigarette smoking; and others. His research has been supported by the National Science Foundation, National Institutes of Health, National Academies of Science, as well as by state agencies and private industry.