Human Analytics: From Biometrics to Biomedicine

Ioannis Kakadiaris

Hugh Roy and Lillie Cranz University Professor



Changing the way

UNIVERSITY of HOUSTON CBI



UNIVERSITY of HOUSTON CBL



- Research Areas
 - Image Analysis
 - Computer Vision / Pattern Recognition
 - Data Analytics / Machine Learning

UNIVERSITY of HOUSTON CBL^{Char}

3

Challenge 1

What's in a Face?



UNIVERSITY of HOUSTON CBL Changing the way pice look at computers people

Facial Analytics

- Biometrics
- Forensics
- Cognitive Psychology
 - Infer Emotional State
 - How do human's recognize faces?
- Medicine
 - Infer health status
- HCI

UNIVERSITY of HOUSTON CBL Changing the way per condition of the condition

Challenge 1

What's in a Face? ECCV 2012 Workshop

12th October 2012



UNIVERSITY of HOUSTON CBL Changing the way pice look at computers people

3D



UNIVERSITY of HOUSTON CBL Changing the way poole look at computers people

3D-3D Face Recognition

Problem Statement:

Given a 3D facial scan, determine or verify the identity of the subject.



I.A. Kakadiaris, G. Passalis, G. Toderici, N. Murtuza, Y. Lu, N. Karampatziakis, and T. Theoharis, "Three-dimensional face recognition in the presence of facial expressions: An annotated deformable model approach," IEEE Trans. on Pattern Analysis and Machine Intelligence, vol. 29, no. 4, pp. 640 -- 649, 2007. VERSITY of HOU

YOUR FACE IS YOUR PASSWORD







Winner of the 3D-shape section of the US NIST Face Recognition Vendor Test



14 10





Publications (www.cbl.uh.edu)

- 3D-3D FR
 - Partial data
 - Twins
- 3D-2D FR
- Profile-Based FR
- Ear Recognition
- 3D Facial Expression Analysis
- 4D Facial Expression Analysis

UNIVERSITY of HOUSTON CBL Changing the way performed and the way p

people

21 Camera System



21 Pod Acquisition: 2D



UNIVERSITY of HOUSTON CBL Changing the way pixele look at computers people



21 Pod Acquisition: 3D



UNIVERSITY of HOUSTON CBL Changing the way people look at computers people

Personalized 3D model from a single image

Problem Statement: Given a 2D image, reconstruct a personalized 3D face model.



P. Dou, Y. Wu, S.K. Shah, I.A. Kakadiaris, "**Robust 3D face shape reconstruction from single images via two-fold coupled structure learning**," In Proc. British Machine Vision Conference, Nottingham, UK, September 1-5, 2014

UNIVERSITY of HOUSTON CBL

14

Hierarchical Multi-label Classification

Problem Statement: Given a segmented image and the conceptual hierarchy, annotate hierarchical labels to each subject.



L.F. Zhang, S.K. Shah and I.A. Kakadiaris, "Fully Associative Ensemble Learning for Hierarchical Multi-Label Classification," In Proc. British Machine Vision Conference, Nottingham, UK, Sep. 1-5, 2014.

UNIVERSITY of HOUSTON

computers



Can we predict your risk for a disease?

UNIVERSITY of HOUSTON CBL Changing the way poole look at computers computers people



American Heart Association. *Heart and Stroke Statistical Update.*

UNIVERSITY of HOUSTON CBL

people

Changing the way people look at computers

computers

Cardiovascular Informatics

To develop the theoretical framework and computational tools to aid physicians in scoring the patients' vulnerability and the likelihood of a future coronary event.



UNIVERSITY of HOUSTON CBL

Computational Methods for the Extraction of CVD Biomarkers from Non-contrast CT Data



UNIVERSITY of HOUSTON CBL Changing the way people look at computers people

Application Domains

Biometrics

- Face Recognition
- Ear Recognition
- Facial Expression Analysis
- Health Computing
 - Cardiovascular Informatics
 - Cancer Informatics
- Neuroinformatics
 - Morphological Reconstruction of Neurons
 - Atlases: Mouse, Zebrafish
- Earth Computing
 - Emergency Management
 - Detection of Natural Resources

UNIVERSITY of HOUSTON CB

Publications: www.cbl.uh.edu

Journal Papers

- B.A. Almogahed and I.A. Kakadiaris, "NEATER: Filtering of over-sampled data using non-cooperative game theory," Soft Computing, 2014 (In Press).
- Y.H. Le, U. Kurkure, and I.A. Kakadiaris, "PDM-ENLOR for Segmentation of Mouse Brain Gene Expression Images," Medical Image Analysis, 2014 (In Press).
- X. Zhao, T. Feng, W. Shi, and I.A. Kakadiaris, "Mobile user authentication using statistical touch dynamics images," IEEE Transactions on Information Forensics and Security, 2014 (In Press).
- P. Moutafis and I.A. Kakadiaris, "Can we do better in unimodal biometric systems? A Rank-based Score Normalization Framework," IEEE Transactions on Cybernetics, 2014 (In Press).
- D.R. Chittajallu, N. Paragios, and I.A. Kakadiaris, "An explicit shape-constrained MRF-based contour evo- lution method for 2D medical image segmentation," IEEE Journal of Biomedical and Health Informatics, vol. 18, no. 1, pp. 120 – 129, 2014.
- S. Balocco, C. Gatta, F. Ciompi, A. Wahle, P. Radeva, S. Carlier, G. Unal, E. Sanidas, F. Mauri, X. Carillo, T. Kovarnik, C.-W. Wang, H.-C. Chen, T.P. Exarchos, D.I. Fotiadis, F. Destrempes, G. Cloutier, O. Pujol, M. Alberti, E.G. Mendizabal-Ruiz, M. Rivera, T. Aksoy, R. Downe, and I.A. Kakadiaris, "Standardized evaluation methodology and reference database for evaluating IVUS image segmentation," in Computerized Medical Imaging and Graphics, vol. 38, no. 2, Barcelona, Spain, 2014, pp. 70 – 90.
- M. Vrigkas, V. Karavasilis, C. Nikou, and I.A. Kakadiaris, "Matching mixtures of curves for human action recognition," Computer Vision and Image Understanding, vol. 119, pp. 27–40, 2014.
- P. Perakis, T. Theoharis, and I.A. Kakadiaris, "Feature fusion for facial landmark detection," Pattern Recognition, vol. 47, no. 9, pp. 2783–2793, 2014.
- K.N. Tran, A. Gala, I.A. Kakadiaris, and S.K. Shah, "Activity analysis in crowded environments using social cues for group discovery and human interaction modeling," Pattern Recognition Letters, vol. 44, pp. 49–57, Jul. 2014.
- X. Zhao, G. Evangelopoulos, D. Chu, S. Shah, and I.A. Kakadiaris, "Minimizing illumination differences for 3D to 2D face recognition using lighting maps," IEEE Transactions on Cybernetics, vol. 44, no. 5, pp. 725–736, May 2014.
- X. Yan, I. A. Kakadiaris, and S. K. Shah, "Modeling local behavior for predicting social interactions towards human tracking," Pattern Recognition, vol. 47, no. 4, pp. 1626–1641, Apr. 2014.

UNIVERSITY of HOUSTON CBL

people

Changing the way people look at composers

computers

Press Coverage



- ABC 13 News
- Fox News
- Local2 News
- **Discovery Channel**

UNIVERSITY of HOUSTON CBL Changing the way pice look at computers people

CBL Roadmap



UNIVERSITY of HOUSTON CBI

Alumni: Academia

CS@UH Computational Biomedicine Lab

RESEARCH

Demos People Current Alumni Projects Publications Sponsors

Alumni











THE ARVARD MEDICAL SCHOOL ADVISER





Name	Position at CBL	Dates at CBL	Current Position
Abby Corrington	High School Student	05/2006 - 08/2006	Student, Rice University, Houston, TX
Alberto Santamaria-Pang	Postdoctoral Fellow	01/2003 - 08/2008	Image Analysis Scientist, GE Global Research, Niskayuna, NY
Alok N. Bandekar	Ph.D. Student	05/2002 - 12/2006	Research Scientist, Visigen Inc., Houston, TX
Amol Pednekar	Ph.D. Student	01/1999 - 12/2003	MR Clinical Scientist, Philips Healthcare, Cleveland, OH
Anders Sundin	Visiting Scholar	04/2002	
Barbara Morales-Quinones	REU Student	06/2008 - 08/2008	Senior, University of Puerto Rico, Mayaguez Campus
Barry Walsh	International Intern	07/2004 06/2005	Financial Engineer Consultant - First Derivatives
Carlos Barron	Ph.D. Student	10/1998 - 12/2003	Professor, CIMAT, Mexico
Celeste Williams	Postdoctoral Fellow	03/2002 - 10/2003	Sr. Scientist, Siemens Molecular Imaging, Hoffma Estates, IL
Celia Ayala	REU Student	05/2006 - 08/2006	
Charalampos Mavroforakis	International Intern	09/2008 - 10/2008	B.Sc. Student, Athens University of Economics and Business, Athens, Greece.
Chris Harding	Ph.D. Student	07/1997 — 05/2001	Associate Professor, Dept. of Geological and Atmospheric Sciences, Iowa State University, Ames, IA
Christian Uehara	Postdoctoral Fellow	07/2002 - 06/2004	Software Engineer, Micrometrics Instrument Corporations, Atlanta, GA
Chrysanthi Chaleva Ntina	M.Sc. Student	01/2011 - 05/2011	M.Sc. Student, Dept. of Computer Science, UH

UNIVERSITY of HOUSTON CBL Changing the way pice look at computers people

24

Alumni: Research Labs & Industry (2)

Accenture offectivo

m









GE Global Research

nicromeritics

The Science and Technology of Small Particles

Google





PHILIPS sense and simplicity

SIEMENS







Alumni			
Name	Position at CBL	Dates at CBL	Current Position
Abby Corrington	High School Student	05/2006 - 08/2006	Student, Rice University, Houston, TX
Alberto Santamaria-Pang	Postdoctoral Fellow	01/2003 - 08/2008	Image Analysis Scientist, GE Global Research, Niskayuna, NY
Alok N. Bandekar	Ph.D. Student	05/2002 - 12/2006	Research Scientist, Visigen Inc., Houston, TX
Amol Pednekar	Ph.D. Student	01/1999 - 12/2003	MR Clinical Scientist, Philips Healthcare, Cleveland, OH
Anders Sundin	Visiting Scholar	04/2002	
Barbara Morales-Quinones	REU Student	06/2008 - 08/2008	Senior, University of Puerto Rico, Mayaguez Campus
Barry Walsh	International Intern	07/2004 - 06/2005	Financial Engineer Consultant - First Derivatives
Carlos Barron	Ph.D. Student	10/1998 - 12/2003	Professor, CIMAT, Mexico
Celeste Williams	Postdoctoral Fellow	03/2002 - 10/2003	Sr. Scientist, Siemens Molecular Imaging, Hoffma Estates, IL
Celia Ayala	REU Student	05/2006 - 08/2006	
Charalampos Mavroforakis	International Intern	09/2008 - 10/2008	B.Sc. Student, Athens University of Economics and Business, Athens, Greece.
Chris Harding	Ph.D. Student	07/1997 — 05/2001	Associate Professor, Dept. of Geological and Atmospheric Sciences, Iowa State University, Ames, IA
Christian Uehara	Postdoctoral Fellow	07/2002 - 06/2004	Software Engineer, Micrometrics Instrument Corporations, Atlanta, GA
Chrysanthi Chaleva Ntina	M.Sc. Student	01/2011 - 05/2011	M.Sc. Student, Dept. of Computer Science, UH

UNIVERSITY of HOUSTON CBL°

Changing the way people look at computers people

Ph.D. Students



Pengfei Dou 314 HBS



Le Anh Vu Ha 330 HBS



Paul Hernandez 316 HBS



Mengjun Leng



326 HBS



Ali Memariani 316 HBS

Xiang Xu

314 HBS



Panagiotis Moutafis 326 HBS

Stanislav Yotov

318 HBS



Nikolaos Sarafianos 330 HBS

Lingfeng Zhang

318 HBS



M.Sc. Student



Zakariyya Mughal International Interns





Oman Magana



Lhoussine Omary 328 HBS

320 HBS

UNIVERSITY of **HOUSTON**

Changing the way people look at composers computers people

Stephen Meriwether

330 HBS

Undergraduate Student

Stephen Meriwether





Abraham Baez

320 HBS

Research Experience

Ioannis A. Kakadiaris ioannisk@uh.edu www.cbl.uh.edu 219 PGH

You are invited to visit & work with us !

UNIVERSITY of HOUSTON CBL Changing the way people look at computers people

27