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Digital Pathology

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Contents

vii	Authors
xi	Conference Committee
xiii	Introduction
XV	Awards
	KEYNOTE AND EMERGING TRENDS
10581 03	Creating synthetic digital slides using conditional generative adversarial networks: application to Ki67 staining [10581-13]
10581 04	Single stain normalization for IHC whole slide images [10581-14]
	MACHINE LEARNING TRENDS
10581 05	SHIFT: speedy histopathological-to-immunofluorescent translation of whole slide images using conditional generative adversarial networks [10581-1]
10581 06	Tumor microenvironment for follicular lymphoma: structural analysis for outcome prediction [10581-2]
10581 07	Deep positive-unlabeled learning for region of interest localization in breast tissue images [10581-3]
10581 08	An application of transfer learning to neutrophil cluster detection for tuberculosis: efficient implementation with nonmetric multidimensional scaling and sampling [10581-4]
10581 09	Role of training data variability on classifier performance and generalizability [10581-5]
	DIAGNOSIS, PROGNOSIS, AND PREDICTIVE ANALYSIS
10581 0A	Computational analysis of the structural progression of human glomeruli in diabetic nephropathy [10581-6]
10581 OB	Examining structural changes in diabetic nephropathy using inter-nuclear distances in glomeruli: a comparison of variously automated methods [10581-7]

10581 OC	Deep variational auto-encoders for unsupervised glomerular classification [10581-8]
10581 OD	Combination of nuclear NF-KB/p65 localization and gland morphological features from surgical specimens is predictive of early biochemical recurrence in prostate cancer patients [10581-9]
10581 OE	A bottom-up approach for tumour differentiation in whole slide images of lung adenocarcinoma [10581-10]
10581 OF	Mitotic cells detection for HEp-2 specimen images using threshold-based evaluation scheme [10581-11]
	DETECTION AND SEGMENTATION
10581 0G	Quantifying cell-type interactions and their spatial patterns as prognostic biomarkers in follicular lymphoma [10581-15]
10581 OH	Automated T1 bladder risk stratification based on depth of lamina propria invasion from H and E tissue biopsies: a deep learning approach [10581-16]
10581 OI	Cancer detection in histopathology whole-slide images using conditional random fields on deep embedded spaces [10581-17]
10581 OJ	Validation of multiplex immunohistochemistry assays using automated image analysis [10581-18]
10581 OK	Color deconvolution method with DAB scatter correction for bright field image analysis [10581-19]
10581 OL	Automatic color unmixing of IHC stained whole slide images [10581-20]
	PRECISION MEDICINE AND GRADING
10581 OM	RaPtomics: integrating radiomic and pathomic features for predicting recurrence in early stage lung cancer [10581-21]
10581 ON	Deformable registration of histological cancer margins to gross hyperspectral images using demons [10581-22]
10581 00	Localization and classification of cell nuclei in post-neoadjuvant breast cancer surgical specimen using fully convolutional networks [10581-23]
10581 OP	Context-based interpolation of coarse deep learning prediction maps for the segmentation of fine structures in immunofluorescence images [10581-24]
10581 0Q	Automatic cancer detection and localization on prostatectomy histopathology images [10581-25]

POSTER SESSION

10581 OR	A watershed and feature-based approach for automated detection of lymphocytes on lung cancer images [10581-26]
10581 OS	Automated segmentation of epithelial tissue in prostatectomy slides using deep learning [10581-27]
10581 OT	Registration parameter optimization for 3D tissue modeling from resected tumors cut into serial H and E slides [10581-28]
10581 OU	Determining tumor cellularity in digital slides using ResNet [10581-29]
10581 OV	3D human lung histology reconstruction and registration to in vivo imaging [10581-30]
10581 OX	CNN based segmentation of nuclei in PAP-smear images with selective pre-processing [10581-32]
10581 OY	Tumor proliferation assessment of whole slide images [10581-33]
10581 OZ	H and E stain augmentation improves generalization of convolutional networks for histopathological mitosis detection [10581-34]
10581 10	Simultaneous segmentation and classification of multichannel immuno-fluorescently labeled confocal microscopy images using deep convolutional neural networks [10581-35]
10581 11	Unsupervised pathology image segmentation using representation learning with spherical k-means [10581-36]
10581 12	Automatic segmentation of histopathological slides of renal tissue using deep learning [10581-37]
10581 13	Scalable storage of whole slide images and fast retrieval of tiles using Apache Spark [10581-38]
10581 14	Glomerular detection and segmentation from multimodal microscopy images using a Butterworth band-pass filter [10581-39]
10581 16	A performance comparison of low- and high-level features learned by deep convolutional neural networks in epithelium and stroma classification [10581-41]
10581 17	Image processing to extend effective OCT penetration depth in tissue [10581-42]
10581 18	Registration accuracy between whole slide images and glass slides in eeDAP workflow [10581-43]
10581 19	Classification of lung cancer histology images using patch-level summary statistics [10581-44]
10581 1A	Segmentation of black ink and melanin in skin histopathological images [10581-45]

10581 1B	Semantic segmentation for prostate cancer grading by convolutional neural networks [10581-46]
10581 1C	SlideSeg: a Python module for the creation of annotated image repositories from whole slide images $[10581\text{-}47]$
10581 1D	An unsupervised network for fast microscopic image registration [10581-48]
10581 1E	Landmark-based reconstruction of 3D smooth structures from serial histological sections [10581-49]
10581 1F	Detecting and segmenting overlapping red blood cells in microscopic images of thin blood smears [10581-50]

Authors

Numbers in the index correspond to the last two digits of the seven-digit citation identifier (CID) article numbering system used in Proceedings of SPIE. The first five digits reflect the volume number. Base 36 numbering is employed for the last two digits and indicates the order of articles within the volume. Numbers start with 00, 01, 02, 03, 04, 05, 06, 07, 08, 09, 0A, 0B...0Z, followed by 10-1Z, 20-2Z, etc.

Akbar, Shazia, 0U

Alemi Koohbanani, Navid, 19

Alsubaie, Najah, 0E Amir Hossain, Md, 1F Andani, Sonali, 07 Andersson, Emilia, OK Andersson, Mats, 0Y Antani, Sameer, 1F Arnold, Corey, 1B Arole, Vidya, 0H Ashton, Garry, 0G Astley, Sue, 0G Atzori, Manfredo, 0Y

Balkenhol, Maschenka, OZ

Bauman, G., 0Q Beamer, Gillian, 08 Bera, Kaustav, OM Berman, Benjamin P., 18 Bhavsar, Arnav, OF, OX Bidart, Rene, 00 Brandwein, Margaret, 0T Bredno, Joerg, 0J Breen, David E., 17 Brieu, Nicolas, OP Bulten, Wouter, OS Burlingame, Erik A., 05 Byers, Richard, 0G Caie, Peter D., 0P Chang, Young Hwan, 05

Chen, Amy Y., 0N Chen, W., 06

Chen, Xi, 1D

Chen, Zhuo Georgia, 0N

Chin, J. L., 0Q Choi, Humberto, 0M Ciompi, Francesco, 0Z Clark, Marcus, 10 Corredor, Germán, OR Crabb, Brendan, 1C Day, William, 0J de Bel, Thomas, 12 de With, Peter H. N., 0I Doyle, Scott, 09, 0T

Du, Yue, 16

Dyduch, Grzegorz, 1A El-Deiry, Mark W., 0N Elliott, Robin, OD Fei, Baowei, ON Fergie, Martin, 0G

Fitzpatrick, Sophie, 0G Fogo, Agnes, 0A Fortin, Dalilah, 0V Gabrani, Maria, 07 Gaed, M., 0Q Gallas, Brandon D., 18 Gangeh, Mehrdad J., 00 Garcia, Fernando U., 17 Gautam, Srishti, OX Gavriel, Christos G., OP Gavrielides, Marios A., 18

Geijs, D. J., 0L

Gertych, Arkadiusz, 1B Ghazvinian Zanjani, Farhad, Ol

Ghodsi, Ali, 00

Giger, Maryellen L., 10 Ginley, Brandon G., 0A, 14

Gomez, J. A., 0Q Gong, Qi, 18

Govind, Darshana, 14 Graham, Simon, 19 Gray, Joe W., 05

Griffith, Christopher C., 0N Grimm, Oliver, 0K

Gunderson, Camille C., 16

Gupta, Krati, 0F Gupta, Sanjay, 0D

Gurcan, Metin N., 03, 06, 08, 0H

Halicek, Martin, 0N Han, Hua, 1D Han, W., 0Q

Harrison, David J., OP Hashizume, Makoto, 1E Hasserijan, R. P., 06 Hedlund, Martin, 0Y Hermsen, Meyke, 12 Hilbrands, Luuk, 12 Hontani, Hidekata, 1E

Hulsbergen-van de Kaa, Christina A., OS

Inculet, Richard, 0V Ing, Nathan, 1B Intezar, M., OL Iwamoto, Chika, 1E Jacobsson, Ludwig, 0Y Jaeger, Stefan, 1F Jain, Sanjay, OA, OB, OC Janowczyk, Andrew, 0D

Jaworek-Korjakowska, Joanna, 1A

Jen, Kuang-Yu, 0A, 0C

Jimenez-del-Toro, Oscar, 0Y Johnson, Carol, 0Q, 0V Johnson, Starr, OT K.K., Harinarayan, 0X Karssemeijer, Nico, 0Z Kawamura, Naoki, 1E Khunger, Arjun, 0M Khurram, Syed Ali, 19 Kłeczek, Paweł, 1A Knudsen, Beatrice S., 1B Kobayashi, Hirokazu, 1E Kwan, Keith, 0V Landis, Mark, 0V Lathen, Gunnar, 0Y

Lech, Martyna, 1A Lee, Cheryl, 0H Leo, Patrick, 0D Li, Jiayun, 1B Liarski, Vladimir, 10 Linton, Kim, 0G

Litjens, Geert J. S., OL, OS, OZ, 12

Little, James V., 0N Liu, Hong, 16

Lopez Barron, Daniel E., 13 Lorsakul, Auranuch, 0J Louie, Alexander, 0V Louissaint, A., 06 Lozanski, Gerard, 03, 06 Lu, Cheng, 0R Lutnick, Brendon, OC, 14 Ma, Zhaoxuan, 1B

Madabhushi, Anant, OD, OM, OR

Maharaj, Shantel, 17 Malthaner, Richard, 0V Margolin, Adam, A., 05 Martel, Anne L., 00, 0U Mattonen, Sarah A., 0V Maude, Richard J., 1F Moallem, Golnaz, 1F Mori, Kensaku, 11 Moriya, Takayasu, 11 Morrison, Larry, 0J Moussa, M., 0Q

Moxley, Katherine M., 16 Mueller, Henning, 0Y Nagara, Kai, 11 Nakamura, Shota, 11 Nandakumar, Gautham, 17 Nelson, Lilli, OG

Niazi, M. Khalid Khan, 08, 0H

Nie, Yao, 04, 0K

Nofech-Mozes, Sharon, 0O, 0U

Norell, Bjorn, OY Ochs, Robert L., 0J Oda, Hirohisa, 11 Oda, Masahiro, 11 Ohuchida, Kenoki, 1E Olson, Niels, 1C

Palhares Viana, Matheus, 07

Palma, David A., 0V

Parwani, Anil V., 0H Patel, Mihir, 0N Pati, Pushpak, 07 Patil, Pradnya, 0M Pautler, S. E., 0Q Pediaditis, Matthew, 07 Peikari, Mohammad, 00, 0U

Pennell, M., 06

Pentinga, Sean A. K., 0V Poostchi, Mahdieh, 1F Qaiser, Talha, 19 Qiu, Yuchen, 16 Rajpoot, Nasir, 0E, 19 Rao, Deepthi, 13 Rao, Praveen, 13 Raza, Shan E. Ahmed, 0E

Rodrigues, George, 0V Roessler, Christian, 0K Romero, Eduardo, OR Roth, Holger R., 11 Rousson, Mikael, 0Y Rüschoff, Jan Hendrik, 07 Saba, Nabil F., 0N Sahiner, Berkman, 03, 06 Sainz de Cea, Maria V., 04 Salama, Sherine, OO, OU Salemi, Hootan, 1B Sao, Anil K., OF, OX

Sarder, Pinaki, OA, OB, OC, 14 Sari-Sarraf, Hamed, 1F Schmidt, Günter, OP Senaras, Caalar, 03, 06 Shaban, Muhammad, 19 Shana'ah, A., 06 Shankar, Eswar, 0D Shu, Chang, 1D Sibley, Adam R., 10 Silamut, Kamolrat, 1F

Sirinukunwattana, Korsuk, 0E

Smeets, Bart, 12 Snead, David, 0E Tadeusiewicz, Ryszard, 1A Tavolara, Thomas E., 0H Tawfik, Ossama, 13 Tellez, David, 0Z Thai, Theresa C., 16 Therrien, Ryan, 09 Thoma, George, 1F

Simon, Olivier, 0B

Tomaszewski, John E., OA, OB, OC, 14

Tozbikian, Gary, 03 Tsakiroglou, Anna Maria, 0G

Vaidya, Pranjal, 0M

van der Laak, J. A. W. M., OL, OS, OZ, 12

Velcheti, Vamsidhar, 0M, 0R Wang, Xiangxue, OM, OR

Wang, Xu, 0N

Ward, Aaron D., 0Q, 0V West, Catharine, 0G Wild, Peter, 07

viii

Xie, Qiwei, 1D Yacoub, Rabi, 0B, 0C Yaremko, Brian, 0V Yarlagadda, Dig Vijay Kumar, 13 Yokota, Tatsuya, 1E Zarella, Mark D., 17 Zargari, Abolfazl, 16 Zeng, Kang, 0G Zhang, Roy, 16 Zheng, Bin, 16 Zinger, Svitlana, 0l

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- 3 Keynote and Emerging Trends Metin N. Gurcan, Wake Forest Baptist Medical Center (United States)
- 4 Detection and Segmentation **Selim Aksoy**, Bilkent University (Turkey)
- 5 Precision Medicine and Grading Elizabeth A. Krupinski, Emory University School of Medicine (United States)

Introduction

This is the sixth year of the Digital Pathology conference that was introduced at the SPIE Medical Imaging Symposium in Orlando, Florida, in 2013. Every year since then, we have seen increased interest, making Digital Pathology one of the prominent conferences at the SPIE Medical Imaging Symposium. The quality of the presented talks, posters, and the resulting papers, as in previous years, continued to be outstanding. This is mainly thanks to our community, who submits some of their best work to this conference, and to the hard work of our program committee, who carefully conduct a rigorous peer-review process to ensure that only the top papers are selected for presentation at the meeting.

The sixth Digital Pathology conference took place 11–12 February at the Marriott Marquis in Houston, Texas, United States. The meeting formally began on 11 February, with a plenary talk given by Dr. Martin Stumpe, entitled, "Advancing Cancer Diagnostics with Deep Learning." Dr. Stumpe leads the Pathology project at Google Research. Dr. Stumpe discussed algorithmic approaches for pathology, including deep learning and some of the challenges faced by researchers in the field. The keynote talk drew in 287 attendees from all the various conferences at the SPIE Medical imaging symposium.

A total of 50 papers were presented during the course of the meeting in both oral and poster form. The sessions included Emerging Trends; Machine Learning Trends; Diagnosis, Prognosis, and Predictive Analysis; Precision Medicine and Grading; and Detection and Segmentation.

We would like to acknowledge the excellent work in the following papers:

Conference finalist of the Robert F. Wagner Best Student Paper Award for Digital Pathology (10581): Combination of nuclear NF-κB/p65 localization and gland morphological features from surgical specimens is predictive of early biochemical recurrence in prostate cancer patients, Student Author: Leo Patrick, Case Western Reserve Univ. (United States) [10581-09]

Cum Laude Poster Award: Landmark-based reconstruction of 3D smooth structures from serial histological sections, Naoki Kawamura, Hirokazu Kobayashi, Tatsuya Yokota, Hidekata Hontani, Nagoya Institute of Technology (Japan); Chika Iwamoto, Kenoki Ohuchida, Makoto Hashizume, Kyushu Univ. (Japan) [10581-49]

Honorable Mention Poster Award: **Registration parameter optimization for 3D tissue modeling from resected tumors cut into serial H&E slides,** Starr Johnson, Univ. at Buffalo (United States); Margaret Brandwein, Icahn School of Medicine at Mount Sinai (United States); Scott Doyle, Univ. at Buffalo (United States) [10581-28]

The continued success of the Digital Pathology conference was in no small part to the outstanding efforts of the program committee, who carefully constructed the program, SPIE Symposium Chairs, Drs. Leonard Berliner and Ronald M. Summers, and SPIE staff, who kindly guided us through all the steps of the program organization.

Next year, the Digital Pathology conference at SPIE Medical Imaging will take place in San Diego, California. We look forward to seeing you there for another successful conference.

Metin N. Gurcan John E. Tomaszewski

2018 Medical Imaging Award Recipients

Robert F. Wagner Best Student Paper Award

Robert F. Wagner was an active scientist in the SPIE Medical Imaging meeting, starting with the first meeting in 1972 and continuing throughout his career. He ensured that the BRH, and subsequently the CDRH, was a sponsor for the early and subsequent Medical Imaging meetings, helping to launch and ensure the historical success of the meeting. The Robert F. Wagner All-Conference Best Student Paper Award (established 2014) is acknowledgment of his many important contributions to the Medical Imaging meeting and his many important advances to the field of medical imaging.



This award is co-sponsored by:



The Medical Image Perception Society



2018 Recipients:

First Place: **Dynamic beam filtering for miscentered patients** (10573-29) Andrew Mao, William Shyr, Grace J. Gang, J. Webster Stayman, Johns Hopkins Univ. (United States)

Second Place: Tumor margin classification of head and neck cancer using hyperspectral imaging and convolutional neural networks (10576-4)

Martin Halicek, Georgia Institute of Technology (United States) and Augusta Univ. (United States); James V. Little, Xu Wang, Emory Univ. School of Medicine (United States); Mihir Patel, Emory Univ. School of Medicine (United States) and The Winship Cancer Institute of Emory Univ. (United States); Christopher C. Griffith, Emory Univ. School of Medicine (United States) and The Winship Cancer Institute of Emory Univ. (United States); Baowei Fei, Georgia Institute of Technology & Emory Univ. (United States) and The Winship Cancer Institute of Emory Univ. (United States)