# PHM 2016

8<sup>th</sup> Annual Conference of the Prognostics and Health Management Society

# **Denver, CO October 3 – 6, 2016**

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www.phmconference.org





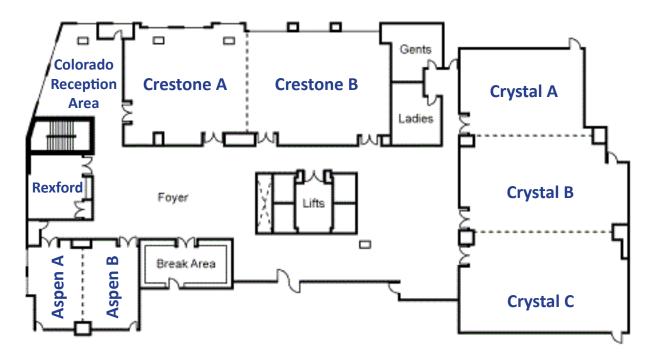


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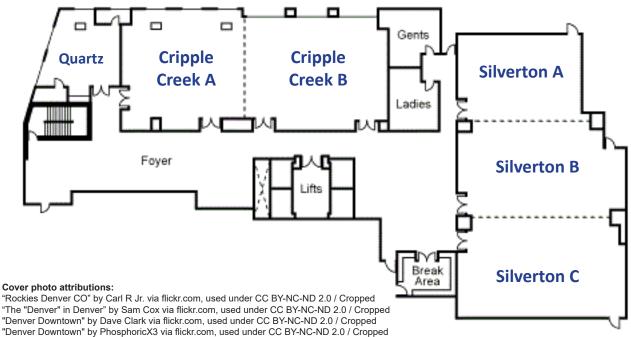


**Embassy Suites Denver Downtown Convention Center** 

3<sup>rd</sup> Floor



### 2<sup>nd</sup> Floor



"Sports Authority Stadium and Denver downtown" by www.bhattacherjee.com via flick.com, used under CC BY-SA 2.0 / Cropped

# Welcome to Denver!

Welcome to beautiful Denver, Colorado, for the 2016 Annual Conference of the Prognostics and Health Management Society. This is the 8<sup>th</sup> annual conference of the PHM Society and we are thrilled to be here in Denver. We have an exciting program this year which builds on the success of our previous conferences. Those of you who attended the conference last year in San Diego, California, know that we have big (well small) flip flops to fill. Two years ago we met in Ft. Worth, TX. If you combine Texas and California, flip flops and cowboy boots, you get river sandals and hiking boots, laid back and high adrenaline. Welcome to Colorado.

Denver has world-class museums, unique downtown arts districts, and highly-varied urban architecture to explore. This includes the iconic Union Station, which serves not only as a transportation hub, but as a foodie mecca with a dozen chef-owned restaurants and bars. The 16th Street Mall, just two blocks away, is a mile-long pedestrian mall designed by the famous architect I.M. Pei, lined with restaurants and shops, and served by free shuttle busses. Other sites in Denver include the Denver Art Museum, the Museum of Nature and Science, the (Unsinkable) Molly Brown House Museum, the Denver Mint (maybe the easiest way to grow your PHM budget), and many other museums within walking distance of the conference hotel. Downtown Denver is also home to a vast number of craft- and micro-breweries; several, including "Wynkoop" and "Great Divide," are right downtown and have late-afternoon and evening tours for anyone interested. If you are sticking around for the weekend, Denver is also home to the Great American Beer Festival, right across the street at the Colorado Convention Center this weekend.

The city is also a hub for various sporting activities. Perhaps we will see some of you out for an early-morning run this week! A great location is the Cherry Creek Trail along Cherry Creek just

on the other side of the Convention Center from the hotel. If you prefer two wheels to two feet, you can rent bicycles from Denver B-Cycle kiosks located around town. Denver is also home to several professional sports teams, including the Rockies, Nuggets, Rapids, Spurs (look that one up), and the World Champion Denver Broncos. While the Rockies' season is over, the Nuggets' hasn't started, and the Broncos don't have a game while we are here, you will get a chance to see and tour Sports Authority Field at Mile High, the Broncos Stadium, where we will have this year's conference banquet.

Last, but certainly not least, Colorado is a worldwide destination for outdoor enthusiasts. Whether you hike, bike, run, climb, ski, or just enjoy the view, Colorado has just about every type of outdoor attraction you can think of. Colorado is home to Rocky Mountain, Mesa Verde, Black Canyon of the Gunnison, and Great Sand Dunes National Parks, and this year is the 100<sup>th</sup> anniversary of the United States National Park Service. Denver sits on what is known as the front range of the Rockies—this is where the Rocky Mountains start! We are hoping for nice, sunny weather while we are here this week, but it won't be too long until the mountains to the west are covered with snow and beckoning skiers to come and play.

We hope that you have a great week here at the PHM Conference and also get a chance to explore downtown Denver and possibly even more of Colorado. If not, we're sure that they would welcome you back. While neither Dave nor Karl are from Colorado, we've both enjoyed visiting here in the past and it's one of our favorite destinations for work and play. We predict that you will have a wonderful time this week.

David Larsen and Karl Reichard 2016 Conference Co-Chairs



Saturday, October 1, 2016				
Location	Location PHM Fundamentals Short Course			
Time	Crystal Ballroom AB	Time		
8am - 5pm	Registration Location: Crystal Ballroom AB	8am - 5pm		
8:00-12:00	8:00 – 12:00 PHM Fundamentals Short Course Separate Registration Required			
12:00-1:00	Lunch	12:00-1:00		
1:00-5:00	PHM Fundamentals Short Course Separate Registration Required	1:00-5:00		

Sunday, October 2, 2016					
Location	PHM Fundamentals Short Course	Doctoral Symposium	Location		
Time	Crystal Ballroom AB	Aspen AB	Time		
12рм – 5рм	Regis	tration Location: 3 <sup>rd</sup> Floor Foyer	12рм – 5рм		
8:00 - 12:00	PHM Fundamentals Short Course Separate Registration Required	Reserved for PHM Conference			
12:00-1:00	Lunch				
	PHM Fundamentals Short Course	Doctoral Symposium	1:00 - 3:00		
1:00 - 5:00	Separate Registration Required	Break	3:00 - 3:30		
		Doctoral Symposium	3:30 - 5:30		
5:00 - 8:30	Reserved for PHM Conference	Doctoral Symposium Dinner	5:30 - 6:30		
0.00		Doctoral Symposium	6:30 - 8:30		

# **Optional Short Course Agenda** (See Page 12 for Details)

Sunday, October 2, 2016

### Saturday, October 1, 2016

#### 8:00 – 10:20 Session 1: Crystal Ballroom AB 8:30-10:30 Session 5: Crystal Ballroom AB Welcome and Introductions **CBM+** Technologies Introduction to PHM **Cost Benefit Analysis Deriving Requirements for PHM** Plenary - Issues and Needs **PHM Performance Metrics** 10:30 - 10:45 Break 10:20 - 10:40 Break 10:40 - 12:00 Session 2: Crystal Ballroom AB 10:45 – 12:30 Session 6: Crystal Ballroom AB **Diagnostics Methods Reliability and Life Cycle Management Diagnostics Case Studies** Fielded Systems Case Studies - 1 12:00 - 1:00Lunch (provided) 12:30 - 1:30 Lunch (provided with evaluation forms) 1:00 - 3:20Session 3: Crystal Ballroom AB Prognostics 1:30 - 3:20 Session 7: Crystal Ballroom AB **Data Analytics Methods** Fielded Systems Case Studies - 2 **Prognostics Case Studies Case Study Workshop Introduction** 3:20 - 3:40Break Case Study Mini workshop 3:40 - 5:15 Session 4: Crystal Ballroom AB 3:20-3:40 Break Sensors and Data Processing Analysis Mini Workshop 3:40-4:15 Session 8: Crystal Ballroom AB Summary of Workshop Results Way Forward 8:00 - ? Non-hosted dinner with all participants Wrap up with Evaluation Forms

	Doctoral Symposium Detail – Sunday, October 2, 2016
1:15 - 1:30	Doctoral Symposium Welcome Jamie Coble
1:30 - 1:40	Presentation #1: Circuit Breaker Health and Reliability Monitoring: The Key to Realizing a Smarter Electricity Grid Payman Dehghanian, <i>Texas A&amp;M University</i>
1:40 - 2:00	Panelist Feedback & Audience Q/A
2:00-2:10	Presentation #2: Algorithms for Hybrid Diagnostics of Nonlinear Systems Turki Haj Mohamad, <i>Villanova University</i>
2:10 - 2:30	Panelist Feedback & Audience Q/A
2:30 - 2:40	Presentation #3: Fault-Tolerant Supervisory Control Mechanism for Chiller Plants Khushboo Mittal, University of Connecticut
2:40 - 3:00	Panelist Feedback & Audience Q/A
3:00 - 3:30	Break
3:30 - 3:40	Presentation #4: Bayesian Cramér-Rao Bounds for Time-of-Failure Probability Mass Function Estimation David Acuña, <i>University of Chile</i>
3:40 - 4:00	Panelist Feedback & Audience Q/A
4:00 - 4:10	Presentation #5: Development of Deep Learning Based Approaches for Rotating Machinery Fault Diagnosis with Big Data Miao He, University of Illinois at Chicago
4:10-4:30	Panelist Feedback & Audience Q/A
4:30 - 4:40	Presentation #6: Model-Based Failure Prognosis Approach for Complex Systems to Support Asset Management Olivier Blancke, <i>École de Technologie Supérieure</i>
4:40 - 5:00	Panelist Feedback & Audience Q/A
5:00 - 5:10	Presentation #7: Toward Battery Health Management for Small-size Battery-powered Rotary-wing Aircraft Gina Sierra, University of Chile
5:10-5:30	Panelist Feedback & Audience Q/A
5:30-6:30	Doctoral Symposium Dinner for participants and panelists
6:30 - 6:40	Presentation #8: Deep Learning Based Diagnosis of Journal Bearing Rotor Systems Joon Ha Jung, <i>Seoul National University</i>
6:40 - 7:00	Panelist Feedback & Audience Q/A
7:00 - 7:10	<b>Presentation #9: Probabilistic Pipe Strength and Toughness</b> <b>Estimation through Information Fusion with Bayesian Updating</b> Sonam Dahire, <i>Arizona State University</i>
7:10 - 7:30	Panelist Feedback & Audience Q/A
7:30 - 7:40	Presentation #10: Meta Learning for Fault Tolerant PHM Systems Considering Correlated Failures Saikath Bhattacharya, University of Massachusetts Dartmouth
7:40 - 8:00	Panelist Feedback & Audience Q/A
8:00 - 8:15	Panelists Final Thoughts
8:15 - 8:20	Feedback from Students & Audience
8:20 - 8:30	Conclusions and Feedback

Monday, October 3, 2016				
Location	n Track A: Technical Paper Sessions Track B: Technical Paper Sessions			
Time	Cripple Creek A	Cripple Creek B		
7ам – 5рм	<u> </u>	tration Location: 3 <sup>rd</sup> Floor Foyer		
8:00 - 9:45	Tutorial Session 1A: <b>Diagnostics</b> Dr. Matthew Daigle (NASA) Dr. Indranil Roychoudhury (NASA)	Tutorial Session 1B: <b>An Introduction to Data-Driven</b> <b>Prognostics of Engineering Systems</b> Dr. Jamie Coble (Univ of Tennessee)		
9:45 - 10:15	Br	eak Location: 3 <sup>rd</sup> Floor Foyer		
10:15 - 12:00	Tutorial Session 2A:     Tutorial Session 2B:       Security Prognostics     Big Data Analytics       Dr. Scott Evans (GE Global Research)     John Patanian (GE Power)			
12:00 - 1:00	Lunch on your own			
1:00 - 1:45	Opening Remarks Location: Crystal Ballroom <b>Opening Keynote: Dr. Jay Lee,</b> <i>University of Cincinnatti</i> "Trends and Recent Advances of Industrial Big Data Analytics and Cyber Physical Systems for PHM Applications"			
1:45 - 3:30	Paper Session 1A: Aviation I Paper Session 1B: Diagnostics I			
3:30 - 3:45	Br	eak Location: 3 <sup>rd</sup> Floor Foyer		
3:45 - 5:30	Paper Session 2A: Systems I	Paper Session 2B: Features I		
5:30 - 7:30	Opening Welcome Reception Location: Crystal Ballroom Foyer			

# **The Conference**

The Prognostics and Health Management Society (PHM Society) welcomes you to its annual international conference. As the Society's annual flagship event, the 2016 PHM Conference brings together the global community of PHM experts from industry, academia, and government in diverse application areas such as smart manufacturing, wind energy, oil and gas, aerospace, transportation, automotive, and industrial automation. The conference features keynote and luminary presentations, invited panel sessions, technology demonstrations, a data challenge, a special session for

Human Assets, a doctoral symposium, tutorials free to all registrants, a dedicated poster session during planned social hours, a Job Fair, and a two-day intensive short course on PHM fundamentals in conjunction with the conference. Several social events will provide opportunities for participants to connect with colleagues.



# **The PHM Society**

For years, the field of PHM was represented under a variety of banners, including aerospace, reliability, failure analysis and prevention, mechanical engineering, and others. PHM is broader than any single field of study. The PHM Society was established to unite the diverse PHM community and to establish PHM as a legitimate scientific and engineering discipline that draws from electrical, mechanical, civil, and chemical engineering, computer and materials science, reliability, test and measurement, artificial intelligence, physics, and economics. We invite you to establish PHM as a meta-discipline that synergizes these fields.

PHM society membership is free and entitles you to full access to papers, tutorials and proceedings.

# What Sets This Conference Apart

A major differentiator for the PHM Society is its contemporary approach toward copyright: the Society does not take ownership of your work! Instead, authors retain copyright through a Creative Commons License while allowing the PHM Society to distribute their work broadly through modern media. As a result, your original articles will reach the entire world for free and without access restrictions.

The conference includes high-quality tutorials, and original contributions submitted as full-length papers and posters. All submissions are reviewed by up to four experts in the field based on the criteria of originality, significance, quality, and clarity. The conference proceedings are published on the web for unrestricted access by the global scholarly and applications community.

# **Mobile App**

The PHM Conference will be using the Whova mobile app this year. Easily access the most up-to-date agenda information, read

full PDF versions of all papers, connect with other attendees, and much more using the free app on your phone or tablet. Get "Whova" from the App Store or Google Play and sign in with your e-mail account. Search for the **PHM2016** event and passcode **phmsociety**, if prompted.



Monday, October 3, 2016				
	Track C: Panel Sessions Track D: Technology Demos		Location	
	Crestone A	Aspen AB	Time	
	Regis	tration Location: 3 <sup>rd</sup> Floor Foyer	7ам — 5рм	
	Reserved for PHM Conference	Reserved for PHM Conference	8:00 - 9:45	
	Br	eak Location: 3 <sup>rd</sup> Floor Foyer	9:45 - 10:15	
	Reserved for PHM Conference	Reserved for PHM Conference	10:15 - 12:00	
	Lunch on your own		12:00 - 1:00	
	Opening Remarks Location: Crystal Ballroom <b>Opening Keynote: Dr. Jay Lee, University of Cincinnatti</b> "Trends and Recent Advances of Industrial Big Data Analytics and Cyber Physical Systems for PHM Applications"		1:00 - 1:45	
	Panel Session 1: <b>PHM For Human Assets I</b> Wolfgang Fink (University of Arizona)	Reserved for PHM Technology Demonstration Setup	1:45 - 3:30	
	Break Location: 3 <sup>rd</sup> Floor Foyer		3:30-3:45	
	Panel Session 1 (cont'd): PHM For Human Assets II Wolfgang Fink (University of Arizona)	Reserved for PHM Technology Demonstration Setup	3:45 - 5:30	
	Opening Welc	ome Reception Location: Crystal Ballroom Foyer	5:30 - 7:30	

#### Paper Session 1A: Aviation I

Monday, 1:45 – 3:30, Room: Cripple Creek A Session Chair: Rhonda Whalthall – UTAS

- Improved Time-Based Maintenance in Aeronautics with Linear Support Vector Machines — Marcia Baptista<sup>1</sup>, Ivo P. de Medeiros<sup>2</sup>, Joao P. Malere<sup>3</sup>, Helmut Prendinger<sup>4</sup>, Cairo L. Nascimento Jr.<sup>5</sup>, Elsa Henriques<sup>6</sup> (<sup>1,6</sup>Universidade de Lisboa, Portugal; <sup>2,3</sup>Embraer SA, Brazil; <sup>4</sup>National Institute of Informatics, Japan)
- Flight Anomaly Tracking for Improved Situational Awareness: Case Study of Germanwings Flight 9525 — Murat Yasar<sup>1</sup> (<sup>1</sup>United Technologies Research Center)
- Anomaly Detection and Fault Disambiguation in Large Flight Data: A Multi-modal Deep Auto-encoder Approach — Kishore K. Reddy<sup>1</sup>, Soumalya Sarkar<sup>2</sup>, Vivek Venugopalan<sup>3</sup>, Michael Giering<sup>4</sup> (<sup>1,2,3,4</sup>United Technologies Research Center)

#### Paper Session 1B: Diagnostics I

Monday, 1:45 - 3:30, Room: Cripple Creek B

#### Session Chair: Abhinav Saxena — NASA

- Solenoid Valve Fault Diagnosis for Urban Railway Braking Systems with Physical Model and Embedded Sensor Signals — Boseong Seo<sup>1</sup>, Sooho Jo<sup>2</sup>, Hyunseok Oh<sup>3</sup>, Byeng D. Youn<sup>4</sup> (<sup>1,2,3,4</sup>Seoul National University, Republic of Korea)
- Spur Gear Electrical Pitting Wear Diagnostic from Tribological Responses — Surapol Raadnui<sup>1</sup> (*'King Mongkut's University* of Technology North Bangkok, Thailand)
- Integration of failure assessments into the diagnostic process — Roxane Koitz<sup>1</sup>, Franz Wotawa<sup>2</sup> (<sup>1,2</sup>Institute for Software Technology, Austria)

#### Paper Session 2A: Systems I

Monday, 3:45 – 5:30, Room: Cripple Creek A Session Chair: Kirtland McKenna — Colorado School of Mines

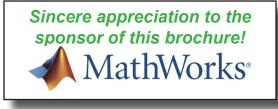
Autonomous Operations System: Development and Application — Jaime A. Toro Medina<sup>1</sup>, Kim N. Wilkins<sup>2</sup>, Mark Walker<sup>3</sup>, Gerald M. Stahl<sup>4</sup> (<sup>1,4</sup>NASA Kennedy Space Center; <sup>2</sup>General Atomics; <sup>3</sup>D2K Technologies) Distributed Real Time Compressor Blade Health Monitoring System — LiJie Yu<sup>1</sup>, Sachin Srivastava<sup>2</sup> (*'GE Power Services* Engineering, USA; <sup>2</sup>GE Power Services Engineering, India)

An Architectural Framework for Reliability Centered Maintenance and Remote Maintenance Monitoring of Complex Distributed Systems — Henry Silcock<sup>1</sup>, Becky Norman<sup>2</sup>, Jason Ricles<sup>3</sup> (<sup>1,2,3</sup>*Mikros Systems Corporation*)

#### Paper Session 2B: Features I

Monday, 3:45 – 5:30, Room: Cripple Creek B

- Session Chair: Ravi Rajamani drR<sup>2</sup> Consulting
  - Leakage Detection of Steam Boiler Tube in Thermal Power Plant Using Principal Component Analysis — Jungwon Yu<sup>1</sup>, Jaeyel Jang<sup>2</sup>, Jaeyeong Yoo<sup>3</sup>, June Ho Park<sup>4</sup>, Sungshin Kim<sup>5</sup> (<sup>1,4,5</sup>Pusan National University, South Korea; <sup>2</sup>Korea East-West Power Co., Ltd., South Korea; <sup>3</sup>XEONET Co., Ltd., South Korea)
  - An Overview of Useful Data Sources and Techniques for Improved Multivariate Diagnostics and Prognostics in Condition-Based Maintenance — Carolin Wagner<sup>1</sup>, Philipp Saalmann<sup>2</sup>, Bernd Hellingrath<sup>3</sup> (<sup>1,2,3</sup>Westfälische Wilhelms-Universität Münster, Germany)



Tuesday, October 4, 2016				
Location	Track A: Technical Paper Sessions	Track B: Technical Paper Sessions		
Time	Cripple Creek A	Cripple Creek B		
7ам — 5рм	Regis	tration Location: 3 <sup>rd</sup> Floor Foyer		
7:45 - 8:00	Continenta	al Breakfast Location: 3 <sup>rd</sup> Floor Foyer		
8:00 - 8:45	Luminary Presentation: Dr. David Hilmers,	Remarks Location: Crystal Ballroom former Astronaut, Baylor College of Medicine in Space and on Earth"		
8:45 - 10:15	Paper Session 3A: Prognostics I	Paper Session 3B: Turbines		
10:15 - 10:30	Br	Location: 3 <sup>rd</sup> Floor Foyer		
10:30 - 12:00	Paper Session 4A: Data Challenge Winners	Paper Session 4B: Diagnostics II		
12:00 - 1:15	Conference Lunch Location: Crystal Ballroom Keynote Speaker: Rhonda Whalthall, United Technologies Aerospace Systems "The Role of PHM at Commercial Airlines"			
1:15 - 3:00	Paper Session 5A: Industrial & Manufacturing Applications I	Paper Session 5B: Features II		
3:00-3:30	Br	eak Location: 3 <sup>rd</sup> Floor Foyer		
3:30 - 5:15	Paper Session 6A: Aviation II	Paper Session 6B: Batteries I		
5:15 - 7:30	Poster R	Reception Location: Crystal Ballroom		

### Paper Session 3A: Prognostics I

Tuesday, 8:45 – 10:15, Room: Cripple Creek A Session Chair: Kai Goebel — NASA Ames

- <sup>†</sup>An Inference-based Prognostic Framework for Health Management of Automotive Systems — Chaitanya Sankavaram<sup>1</sup>, Anuradha Kodali<sup>2</sup>, Krishna Pattipati<sup>3</sup>, Satnam Singh<sup>4</sup>, Yilu Zhang<sup>5</sup>,<sup>6</sup> (<sup>1,2,3</sup>University of Connecticut; <sup>2</sup>University of California Santa Cruz, NASA Ames Research Cente; <sup>4</sup>CA Technologies, GM India Science Lab, India)
- PHM Decision Support Under Uncertainty Murat Yasar<sup>1</sup>, Teems Lovett<sup>2</sup> (<sup>1,2</sup>United Technologies Research Center)
- A New Prognostics Approach for Bearing Based on Entropy Decrease and Comparison with existing Methods — Seokgoo Kim<sup>1</sup>, Sungho Park<sup>2</sup>, Ju-Won Kim<sup>3</sup>, Junghwa Han<sup>4</sup>, Dawn An<sup>5</sup>, Nam Ho Kim<sup>6</sup>, Joo-Ho Choi<sup>7</sup> (<sup>1.2.7</sup>Korea Aerospace University, Korea; <sup>3.4</sup>Korea Railroad Corporation, Korea; <sup>5.6</sup>University of Florida)

### Paper Session 3B: Turbines

Tuesday, 8:45 – 10:15, Room: Cripple Creek B

- Session Chair: Ian Jennions Cranfield University
  - Enhancing Turbine Performance Degradation Prediction with Atmospheric Factors — Xiaomo Jiang<sup>1</sup>, TsungPo Lin<sup>2</sup>, Eduardo Mendoza<sup>3</sup> (<sup>1,2,3</sup>General Electric Company)
  - Gas Turbine Engine Health Data Analysis for Parameter Reduction and Condition Assessment — Amar Kumar<sup>1</sup>, Alka Srivastava<sup>2</sup>, Nita Goel<sup>3</sup>, Marzia Zaman<sup>4</sup> (<sup>1,2,3,4</sup>*Tecsis Corporation*)

Method and System for Predicting Hydraulic Valve Degradation on a Gas Turbine — James D'Amato<sup>1</sup>, John Patanian<sup>2</sup> (<sup>1,2</sup>GE Power)

#### Paper Session 4A: Data Challenge Winners

Tuesday, 10:30 – 12:00, Room: Cripple Creek A Session Chair: Nicholas Propes — Seagate

<sup>†</sup>Invited paper published in IJPHM (www.ijphm.org)

### Paper Session 4B: Diagnostics II

Tuesday, 10:30 – 12:00, Room: Cripple Creek B

Session Chair: Scott Clements — Lockheed Martin Aeronautics

- A Computationally-Efficient Inverse Approach to Strain-Based Damage Diagnosis — James E. Warner<sup>1</sup>, Jacob D. Hochhalter<sup>2</sup>, William P. Leser<sup>3</sup>, Patrick E. Leser<sup>4</sup>, John A. Newman<sup>5</sup> (<sup>1,2,3,4,5</sup>NASA Langley Research Center)
- Reducing Tachometer Jitter to Improve Gear Fault Detection Eric Bechhoefer<sup>1</sup>, Dave He<sup>2</sup> (<sup>1</sup>GPMS Inc.; <sup>2</sup>University of Illinois at Chicago)
- Distributed Adaptive Fault-Tolerant Formation Control of Second-Order Multi-Agent Systems with Actuator Faults — Mohsen Khalili<sup>1</sup>, Xiaodong Zhang<sup>2</sup>, Yongcan Cao<sup>3</sup> (*<sup>1,2</sup>Wright State University;* <sup>3</sup>University of Texas, San Antonio)

#### Paper Session 5A: Industrial & Manufacturing Applications I

Tuesday, 1:15 - 3:00, Room: Cripple Creek A

- Session Chair: Douglas L. Van Bossuyt Colorado School of Mines
  - Inertial Measurement Unit for On-Machine Diagnostics of Machine Tool Linear Axes — Gregory W. Vogl<sup>1</sup>, M. Alkan Donmez<sup>2</sup>, Andreas Archenti<sup>3</sup>, Brian A. Weis<sup>4</sup> (<sup>1,2,4</sup>National Institute of Standards and Technology; <sup>3</sup>KTH Royal Institute of Technology, Sweden)
  - Condition Based Monitoring for A Hydraulic Actuator Stephen Adams<sup>1</sup>, Peter A. Beling<sup>2</sup>, Kevin Farinholt<sup>3</sup>, Nathan Brown<sup>4</sup>, Sherwood Polter<sup>5</sup>, Qing Dong<sup>6</sup> (<sup>1,2</sup>University of Virginia; <sup>3,4</sup>Luna Innovations Inc.; <sup>5,6</sup>Naval Surface Warfare Center)
  - <sup>†</sup>Present Status and Future Growth of Advanced Maintenance Technology and Strategy in US Manufacturing — Xiaoning Jin<sup>1</sup>, Brian A. Weiss<sup>2</sup>, David Siegel<sup>3</sup>, Jay Lee<sup>4</sup> (<sup>1</sup>Northeastern University; <sup>2</sup>National Institute of Standards and Technology; <sup>3,4</sup>University of Cincinnati)

#### Paper Session 5B: Features II

Tuesday, 1:15 – 3:00, Room: Cripple Creek B

Tuesday, October 4, 2016				
Track C: Panel Sessions Track D: Technology Demos		Location		
Crestone A	Aspen AB	Time		
Regis	tration Location: 3 <sup>rd</sup> Floor Foyer	7ам – 5рм		
Continenta	l Breakfast Location: 3 <sup>rd</sup> Floor Foyer	7:45 - 8:00		
Luminary Presentation: Dr. David Hilmers,	Remarks Location: Crystal Ballroom former Astronaut, Baylor College of Medicine in Space and on Earth"	8:00 - 8:45		
Wind Energy         Smartphone Based Multi-Modal           Junda Zhu (NRG)         Sensor Fusion for PHM [UTRC]		8:45 - 10:15		
Br	eak Location: 3 <sup>rd</sup> Floor Foyer	10:15 - 10:30		
Panel Session 3: Oil and Gas, Automation and PHM Rune Schlanbusch (Teknova AS)	Technology Demonstration: Machine Learning for Monitoring System Health [MathWorks]	10:30 - 12:00		
Conference Lunch Location: Crystal Ballroom Keynote Speaker: Rhonda Whalthall, United Technologies Aerospace Systems "The Role of PHM at Commercial Airlines"		12:00 - 1:15		
Panel Session 4: Automotive PHM & Advanced Analytics Steven W. Holland (General Motors)	Technology Demonstration: Rapid Oil Debris Identification via ChipCHECK [GasTOPS]	1:15 - 3:00		
Br	eak Location: 3 <sup>rd</sup> Floor Foyer	3:00 - 3:30		
Panel Session 5: PHM Education and Professional Development Jeff Bird (TECnos), Karl Reichard (Penn State)	Technology Demonstration: Smartphone Based Multi-Modal Sensor Fusion for PHM [UTRC]	3:30 - 5:15		
Poster R	eception Location: Crystal Ballroom	5:15 - 7:30		

#### Session Chair: Jeff Bird — TECnos

- Time Domain Reflectometry (TDR) Sensor Measurement in Contaminated Oils — Jonathan Geisheimer<sup>1</sup>, Shilpa Jagannath<sup>2</sup>, Farhana Zaman<sup>3</sup> (<sup>1.2.3</sup>Meggitt Sensing Systems) Evaluation of Features with Changing Effectiveness for Prognostics — Vepa Atamuradov<sup>1</sup>, Fatih Camci<sup>2</sup> (<sup>1</sup>Mevlana University, Turkey; <sup>2</sup>Antalya International University, Turkey)
- A Qualitative Fault Isolation Approach for Parametric and Discrete Faults Using Structural Model Decomposition — Matthew Daigle<sup>1</sup>, Anibal Bregon<sup>2</sup>, Indranil Roychoudhury<sup>3</sup> (<sup>1,3</sup>NASA Ames Research Center; <sup>2</sup>University of Valladolid, Spain; <sup>3</sup>SGT, Inc.)

#### Paper Session 6A: Aviation II

Tuesday, 3:30 – 5:15, Room: Cripple Creek A

- Session Chair: Giovanni Jacazio Polytechnic University of Turin An Application of Data Driven Anomaly Identification to Spacecraft Telemetry Data — Gautam Biswas<sup>1</sup>, Hamed Khorasgani<sup>2</sup>, Gerald Stanje<sup>3</sup>, Abhishek Dubey<sup>4</sup>, Somnath Deb<sup>5</sup>, Sudipto Ghoshal<sup>6</sup> (<sup>1,2,3,4</sup>Vanderbilt University; <sup>5,6</sup>Qualtech Systems, Inc.)
  - System-Level Prognostics for The National Airspace Matthew Daigle<sup>1</sup>, Shankar Sankararaman<sup>2</sup>, Indranil Roychoudhury<sup>3</sup> (<sup>1,2,3</sup>NASA Ames Research Center; <sup>2,3</sup>SGT, Inc.)
  - Prognostic Reasoner Based Adaptive Power Management System for A More Electric Aircraft — Robin Kuttikkadan Sebastian<sup>1</sup>, Suresh Perinpinayagam<sup>2</sup>, Alirza Alghassi<sup>3</sup> (<sup>1</sup>Hindustan Aeronautics Limited, India; <sup>2.3,4</sup>Cranfield University, UK)

#### Paper Session 6B: Batteries I

Tuesday, 3:30 – 5:15, Room: Cripple Creek B Session Chair: Amir Kashani — University of Maryland

Remaining Useful Life Predictions in Lithium-Ion Battery Under Composite Condition — Yejin Kim<sup>1</sup>, Jongsoo Lee<sup>2</sup> (<sup>1,2</sup>Yonsei University, Republic Of Korea)

- Particle-Filtering-Based State-Of-Health Estimation and Remaining Useful Life Prognosis for Lithium-Ion Batteries at Operation Temperature — Daniel Pola<sup>1</sup>, Felipe Guajardo<sup>2</sup>, Esteban Jofre <sup>'3</sup>, Vanessa Quintero<sup>4</sup>, Aramis Perez<sup>5</sup>, David Acu~na<sup>6</sup>, Marcos Orchard<sup>7</sup> (<sup>1,2,3,4,5,6,7</sup>Universidad de Chile, Chile)
- Used Lubricating Oil Filter Debris Analysis (FDA) for Problem Diagnostic of Oil Lubricated Machinery — Surapol Raadnui<sup>1</sup> (<sup>1</sup>King Mongkut's University of Technology North Bangkok, Thailand)

# **Technology Demonstrations**

Tuesday, October 4, 2016	Aspen AB
UTRC	
8:45 – 10:15 and 3:30 – 5:15	
Smartphone Based Multi-Modal Sensor Fusion f	or PHM
MathWorks	
10:30 – 12:00	
Machine Learning for Monitoring System Health	
GasTOPS	
1:15 – 3:00	
Rapid Oil Debris Identification via ChipCHECK	
Wednesday, October 5, 2016	Aspen AB
Metis/UTAS	
8:45 – 9:15, 9:45 – 10:15, 3:30 – 4:00 and 4:30 -	- 5:15
PHM for Static Components	
MathWorks	
10:30 – 12:00	
Machine Learning for Monitoring System Health	
GasTOPS	
1:15 – 3:00	
Rapid Oil Debris Identification via ChipCHEC	

Wednesday, October 5, 2016					
Location	Track A: Technical Paper Sessions	Track B: Technical Paper Sessions			
Time	Cripple Creek A	Cripple Creek B			
7ам – 5рм	Regis	stration Location: 3 <sup>rd</sup> Floor Foyer			
7:45 - 8:00		al Breakfast Location: 3 <sup>rd</sup> Floor Foyer			
8:00 - 8:45	Luminary Presentation: Dr. D	Remarks Location: Crystal Ballroom aniel Mack, <i>Kansas City Royals</i> From Aircraft to Player Performance"			
8:45 - 10:15	Paper Session 7A: Deep Learning I	Paper Session 7B: Systems II			
10:15 - 10:30	Bi	reak Location: 3 <sup>rd</sup> Floor Foyer			
10:30 - 12:00	Paper Session 8A: Data Driven Methods	Paper Session 8B: Prognostics II			
12:00 - 1:15	Lunch or	n your own			
1:15 - 3:00	Paper Session 9A: Missing Data	Panel Session 8: Railway PHM David Siegel (Predictronics)			
3:00 - 3:30	Bi	reak Location: 3 <sup>rd</sup> Floor Foyer			
3:30 - 5:15	Paper Session 10A: Deep Learning II	Paper Session 10B: Industrial & Manufacturing Applications II			
5:15 - 5:30	Free Time				
5:30-6:00	Buses to Banquet				
6:00 - 9:30	PHM Conference BanquetFor guest tickets, pleaseSports Authority at Mile High Stadiumsee Registration Desk				
9:30 - 10:00	10:00 Busses Return to Hotel				
	For Co-located DX-2016 Session Schedule, see Page 11				

#### Paper Session 7A: Deep Learning I

Wednesday, 8:45 – 10:15, Room: Cripple Creek A

Session Chair: Steven Adams — University of Virginia

- Deep Learning Based Diagnostics of Orbit Patterns in Rotating Machinery — Haedong Jeong<sup>1</sup>, Sunhee Woo<sup>2</sup>, Suhyun Kim<sup>3</sup>, Seungtae Park<sup>4</sup>, Heechang Kim<sup>5</sup>, Seungchul Lee<sup>6</sup> (<sup>1,2,3,4,5,6</sup>Ulsan National Institute of Science and Technology, Korea)
- Using Deep Learning Based Approaches for Bearing Fault Diagnosis with AE Sensors — Miao He<sup>1</sup>, David He<sup>2</sup>, Eric Bechhoefer<sup>3</sup> (<sup>1,2</sup>University of Illinois at Chicago; <sup>3</sup>Green Power Monitoring Systems)
- <sup>†</sup>Combining Deep Learning and Survival Analysis for Asset Health Management — Linxia Liao<sup>1</sup>, Hyung-il Ahn<sup>2</sup> (<sup>†</sup>*GE Digital;* <sup>2</sup>*Noodle Analytics, Inc.*)

#### Paper Session 7B: Systems II

Wednesday, 8:45 - 10:15, Room: Cripple Creek B

- Session Chair: Carl Byington Impact Technologies/Sikorsky, A Lockheed Martin Company
  - Case Study in Improving the Health of a Remote Monitoring & Diagnostics Center Sanjeev Heda<sup>1</sup> (*'GE Power*)
  - Critical Components Selection for A Prognostics and Health Management System Design: An Application to an Overhead Contact Line System — M. Brahim<sup>1</sup>, K. Medjaher<sup>2</sup>, M. Leouatni<sup>3</sup>, N. Zerhouni<sup>4</sup> (<sup>1,4</sup>FEMTO-ST Institute, France; <sup>1,3</sup>ALSTOM, France; <sup>2</sup>INP-ENIT, France)

#### <sup>†</sup>Invited paper published in IJPHM (www.ijphm.org)

Engine Health Management in Safran Aircraft Engines — Guillaume Bastard<sup>1</sup>, Jérome Lacaille<sup>2</sup>, Josselin Coupard<sup>3</sup>, Yacine Stouky<sup>4</sup> (<sup>1,2,3,4</sup>Safran Aircraft Engines, France)

#### Paper Session 8A: Data Driven Methods

Wednesday, 10:30 – 12:00, Room: Cripple Creek A Session Chair: Jon Bednar — Boeing

- A Data-Driven Health Management Application for Failure Detection and Diagnosis in Electrical Submersible Pumps
   — Supriya Gupta<sup>1</sup>, Michael Nikolaou<sup>2</sup>, Luigi Saputelli<sup>3</sup> (<sup>1,2</sup>University of Houston; <sup>3</sup>Frontender Corporation)
- Reciprocating Compressor Valve Condition Monitoring Using Image-Based Pattern Recognition — John N. Trout<sup>1</sup>, Jason R. Kolodziej<sup>2</sup> (<sup>1,2</sup>Rochester Institute of Technology; <sup>5</sup>Instituto Tecnologico de Aeronautica, Brazil)
- Comparison of Model-Based Vs. Data-Driven Methods for Fault Detection and Isolation in Engine Idle Speed Control System — Ruochen Yang<sup>1</sup>, Giorgio Rizzoni<sup>2</sup> (<sup>1,2</sup>Center for Automotive Research; <sup>1,2</sup>Ohio State University)

#### Paper Session 8B: Prognostics II

Wednesday, 10:30 – 12:00, Room: Cripple Creek B

- Session Chair: Ash Thacker Global Technology Connection Deriving Prognostic Continuous Time Bayesian Networks from Fault Trees — Logan Perreault<sup>1</sup>, Monica Thornton<sup>2</sup>, John W. Sheppard<sup>3</sup> (<sup>1,2,3</sup>Montana State University)
- Probabilistic Prognosis of Non-Planar Fatigue Crack Growth — Patrick E. Leser<sup>1</sup>, John A. Newman<sup>2</sup>, James E. Warner<sup>3</sup>,

	Wednesday, October 5, 2016				
	Track C: Panel Sessions Track D: Technology Demos		Location		
	Crestone A	Aspen AB	Time		
	Regist	tration Location: 3 <sup>rd</sup> Floor Foyer	7ам – 5рм		
	Continenta	l Breakfast Location: 3 <sup>rd</sup> Floor Foyer	7:45 - 8:00		
	Opening				
	Luminary Presentation: Dr. Da "Diagnostics with a Noisy Sensor: F		8:00 - 8:45		
_	Panel Session 6:	Technology Demonstration:			
	PHM Standards Experience for Manufacturing	PHM for Static Components	8:45 - 10:15		
	Jeff Bird (Rogers), Ravi Rajamani (drR <sup>2</sup> Consulting)	[Metis/UTAS]			
	Bre	eak Location: 3 <sup>rd</sup> Floor Foyer	10:15 - 10:30		
	Panel Session 7:	Technology Demonstration:			
	Smart Manufacturing PHM	Machine Learning for Monitoring	10:30 - 12:00		
	Brian A. Weiss (NIST)	System Health [MathWorks]	12.00 1.15		
	Lunch on your own Panel Session 9:		12:00 - 1:15		
	Department of Defense (DoD) Condition Based Mainte-	Technology Demonstration:			
	nance Plus (CBM+) Service Panel Review Kapin Daste (LS (Amm)) Kapin Daste (LS (Amm)) Kapin Daste (LS (Amm)) Kapin Daste (LS (Amm)) Kapin Daste (LS (Amm))		1:15 - 3:00		
	Kevin Bostick (U.S. Army)				
	Bre	eak Location: 3 <sup>rd</sup> Floor Foyer	3:00 - 3:30		
	Panel Session 10: Select Military Maintenance Projects Funded through	Technology Demonstration:			
	the Commercial Technologies for Maintenance Activi-	PHM for Static Components	3:30 - 5:15		
	ties (CTMA) Program	[Metis/UTAS]			
	Debbie Lilu (NCMS)				
	Free Time		5:15 - 5:30		
	Buses to Banquet		5:30 - 6:00		
	PHM Conference Banquet         For guest tickets, please           Sports Authority at Mile High Stadium         see Registration Desk		6:00 - 9:30		
	Busses Return to Hotel		9:30 - 10:00		
	For Co-located DX-	2016 Session Schedule, see Page 11			

William P. Leser<sup>4</sup>, Jacob D. Hochhalter<sup>5</sup>, Fuh-Gwo Yuan<sup>6</sup> (<sup>1,2,3,4,5</sup>NASA Langley Research Center; <sup>6</sup>North Carolina State University)

A Modelling Ecosystem for Prognostics — L. Astfalck<sup>1</sup>, M.R. Hodkiewicz<sup>2</sup>, A. Keating<sup>3</sup>, E. Cripps<sup>4</sup>, M. Pecht<sup>5</sup> (1.2.3.4 University of Western Australia, Australia; <sup>5</sup>University of Maryland)

#### Paper Session 9A: Missing Data

Wednesday, 1:15 – 3:00, Room: Cripple Creek A

Session Chair: Peter Beling — University of Virginia

- Application of Multiple-Imputation-Particle-Filter For Parameter Estimation of Visual Binary Stars with Incomplete Observations
   — Rubén M. Clavería<sup>1</sup>, David Acuña<sup>2</sup>, René A. Mendez<sup>3</sup>, Jorge F. Silva<sup>4</sup>, Marcos E. Orchard<sup>5</sup> (<sup>12,3,4,5</sup>Universidad de Chile,
- Chile) Failure Prognostics with Missing Data Using Extended
- Kalman Filter Wlamir Olivares Loesch Vianna<sup>1</sup>, Takashi Yoneyama<sup>2</sup> (<sup>1</sup>*EMBRAER S.A., Brazil;* <sup>2</sup>*Instituto Tecnol'ogico de Aeronautica, Brazil*)
- <sup>†</sup>On the Practical Performance of Minimal Hitting Set Algorithms from a Diagnostic Perspective — Ingo Pill<sup>1</sup>, Thomas Quaritsch<sup>2</sup>, Franz Wotawa<sup>3</sup> (<sup>1,2,3</sup>Graz University of Technology, Austria; <sup>2</sup>HTL Pinkafeld)

#### Paper Session 10A: Deep Learning II

Wednesday, 3:30 - 5:15, Room: Cripple Creek A

<sup>†</sup>Invited paper published in IJPHM (www.ijphm.org)

- Session Chair: Scott Clements Lockheed Martin Aeronautics Deep Health Indicator Extraction: A Method Based On Auto-Encoders and Extreme Learning Machines — Yang Hu<sup>1</sup>, Thomas Palmé<sup>2</sup>, Olga Fink<sup>3</sup> (<sup>1,3</sup>Zurich University of Applied Sciences, Switzerland: <sup>2</sup>General Electric, Switzerland)
  - Using Deep Learning Based Approaches for Bearing Remaining Useful Life Predication — Jason Deutsch<sup>1</sup>, David He<sup>2</sup> (<sup>1,2</sup>University of Illinois at Chicago)
  - Deep Learning for Structural Health Monitoring: A Damage Characterization Application — Soumalya Sarkar<sup>1</sup>, Kishore K. Reddy<sup>2</sup>, Michael Giering<sup>3</sup>, Mark R. Gurvich<sup>4</sup> (<sup>1,2,3,4</sup>United Technologies Research Center)

Paper Session 10B: Industrial & Manufacturing Applications II Wednesday, 3:30 – 5:15, Room: Cripple Creek B

Session Chair: Brian A. Weiss — National Institute of Standards

- Case Study of a Faulted Planet Bearing Eric Bechhoefer<sup>1</sup>, Dave He<sup>2</sup> (*<sup>1</sup>GPMS Inc.*; <sup>2</sup>University of Illinois at Chicago)
- Towards Detection of Water Management Faults for PEM Fuel Cells Under Variable Load — Pavle Boškoski<sup>1</sup>, Andrej Debenjak<sup>2</sup>, Đani Juric?ic <sup>3</sup>, Biljana Mileva Boshkoska<sup>4</sup> (<sup>1,2,3</sup>Jožef Stefan Institute, Slovenia; <sup>4</sup>Faculty of Information Studies in Novo mesto, Slovenia)
- Hidden Markov Model Based Detection and Classification of Foreign Objects in Heat-Exchanger Tubes — Portia Banerjee<sup>1</sup>, Lalita Udpa<sup>2</sup>, Satish Udpa<sup>3</sup> (<sup>1.2,3</sup>*Michigan State University*)

Thursday, October 6, 2016				
Location	Track A: Technical Paper Sessions	Track B: Technical Paper Sessions		
Time	Cripple Creek A	Cripple Creek B		
7ам — 12рм	Regis	stration Location: 3 <sup>rd</sup> Floor Foyer		
7:45 - 8:00	Continenta	al Breakfast Location: 3 <sup>rd</sup> Floor Foyer		
8:00 - 8:45	Opening Remarks Location: Crystal Ballroom Joint PHM/DX Keynote Presentation: Dr. Rui Abreu, PARC "Testing and Debugging Software-Intensive Systems"			
8:45 - 10:15	Paper Session 11A: Structural Health Management	Paper Session 11B: Batteries II		
10:15 - 10:30	Br	reak Location: 3 <sup>rd</sup> Floor Foyer		
10:30 - 12:00	Paper Session 12A: PHM for Electrical Systems	Paper Session 12B: Deep Learning III		
12:00 - 1:15	Lunch on	ı your own		
1:15 - 3:00	Reserved for PHM Conference	Reserved for PHM Conference		
3:00 - 3:30	Closing	Remarks Location: Crestone A		
Continue to Enjoy DX-2016 and Denver. See You in 2017 in St. Petersburg, FL!				

### Paper Session 11A: Structural Health Management

Thursday, 8:45 – 10:15, Room: Cripple Creek A

Session Chair: Abbas Chokor — Arizona State University

- Detection of Fatigue Cracks in Shafts Via Analysis of Vibrations and Orbital Paths — R. Peretz<sup>1</sup>, L. Rogel<sup>2</sup>, J. Bortman<sup>3</sup>, R. Klein<sup>4</sup> (<sup>1,2,3</sup>Ben-Gurion University of the Negev, Israel; <sup>4</sup>R.K. Diagnostics, Israel)
- <sup>†</sup>Big Data Analytics in Online Structural Health Monitoring Guowei Cai<sup>1</sup>, Sankaran Mahadevan<sup>2</sup> (<sup>1,2</sup>Vanderbilt University)
- Quadrotor Actuator Fault Diagnosis with Real-Time Experimental Results — Remus Avram<sup>1</sup>, Xiaodong Zhang<sup>2</sup>, Mohsen Khalili<sup>3</sup> (<sup>1,2,3</sup>Wright State University)

#### Paper Session 11B: Batteries II

Thursday, 8:45 – 10:15, Room: Cripple Creek B

Session Chair: Peter Beling — University of Virginia

- Parameters Optimization of Lebesgue Sampling-Based Fault Diagnosis and Prognosis with Application to Li-Ion Batteries — Wuzhao Yan<sup>1</sup>, Bin Zhang<sup>2</sup>, Marcos Orchard<sup>3</sup> (<sup>1,2</sup>University of South Carolina; <sup>3</sup>Universidad de Chile, Chile)
- A Fusion Method Based On Unscented Particle Filter and a Naive Bayes Model for Lithium-Ion Battery Remaining Useful Life Prediction — Jiayu Chen<sup>1</sup>, Dong Zhou<sup>2</sup>, Chuan Lu<sup>3</sup> (<sup>1.2.3</sup>Beihang University, China)
- Data-Driven Prognostics of Lithium-Ion Rechargeable Battery Using Bilinear Regression — Charlie Hubbard<sup>1</sup>, John Bavlsik<sup>2</sup>, Chinmay Hegde<sup>3</sup>, Chao Hu<sup>4</sup> (*1.2.3.4 lowa State University*)



#### <sup>†</sup>Invited paper published in IJPHM (www.ijphm.org)

#### Paper Session 12A: PHM for Electrical Systems

Thursday, 10:30 – 12:00, Room: Cripple Creek A

Session Chair: José Celaya — Schlumberger

- A Review of Photovoltaic Systems Prognostics and Health Management: Challenges and Opportunities — Abbas Chokor<sup>1</sup>, Mounir El Asmar<sup>2</sup>, Sumanth V. Lokanath<sup>3</sup> (<sup>1,2</sup>Arizona State University; <sup>3</sup>First Solar Inc.)
- Failure Precursor Identification and Degradation Modeling for Insulated Gate Bipolar Transistors Subjected to Electrical Stress — Junmin Lee<sup>1</sup>, Hyunseok Oh<sup>2</sup>, Chan Hee Park<sup>3</sup>, Byeng D. Youn<sup>4</sup>, Deog Hyeon Kim<sup>5</sup>, Byung Hwa Kim<sup>6</sup>, Yong Un Cho<sup>7</sup> (1.2.3.4 Seoul National University, Republic of Korea; <sup>5,6,7</sup>Hyundai Motor Group, Republic of Korea; <sup>1,5,6</sup>General Motors Global R&D)
- Impedance-Based Health Monitoring of Electromagnetic Coil Insulation Subjected to Corrosive Deterioration — N. Jordan Jameson<sup>1</sup>, Michael H. Azarian<sup>2</sup>, Michael Pecht<sup>3</sup> (<sup>1,2,3</sup>CALCE, University of Maryland)

#### Paper Session 12B: Deep Learning III

Thursday, 10:30 – 12:00, Room: Cripple Creek B Session Chair: David Siegel — Predictronics

- <sup>†</sup>Wearable EEG-based Activity Recognition in PHM-related Service Environment via Deep Learning — Soumalya Sarkar<sup>1</sup>, Kishore Reddy<sup>2</sup>, Alex Dorgan<sup>3</sup>, Cali Fidopiastis<sup>4</sup>, Michael Giering<sup>5</sup> (<sup>1,2,3,4,5</sup>United Technologies Research Center)
- Smart Diagnosis of Journal Bearing Rotor Systems: Unsupervised Feature Extraction Scheme by Deep Learning
   Hyunseok Oh<sup>1</sup>, Byung Chul Jeon<sup>2</sup>, Joon Ha Jung<sup>3</sup>, Byeng
   D. Youn<sup>4</sup> (<sup>1,2,3,4</sup>Seoul National University, Republic of Korea)
- <sup>†</sup>Prognostics of Combustion Instabilities from Hi-speed Flame Video using a Deep Convolutional Selective Autoencoder — Adedotun Akintayo<sup>1</sup>, Kin Gwn Lore<sup>2</sup>, Soumalya Sarkar<sup>3</sup>, Soumik Sarkar<sup>4</sup> (<sup>1.2.4</sup>*Iowa State University; <sup>3</sup>United Technologies Research Center*)

Thursday, October 6, 2016				
	Track C: Panel Sessions Track D: Technology Demos		ology Demos	Location
	Crestone A	Aspen	AB	Time
	Regis	tration	Location: 3 <sup>rd</sup> Floor Foyer	7ам – 12рм
	Continenta	ıl Breakfast	Location: 3rd Floor Foyer	7:45 - 8:00
	Opening Remarks Location: Crystal Ballroom Joint PHM/DX Keynote Presentation: Dr. Rui Abreu, PARC "Testing and Debugging Software-Intensive Systems"		8:00 - 8:45	
	Panel Session 11: <b>Big Data Analytics</b> Jonathan Bednar (Boeing)	Reserved for PH.	M Conference	8:45 - 10:15
	Br	eak Location: 3 <sup>rd</sup> Floor Foyer		10:15 - 10:30
	PHM2017 Planning Session Volunteers Welcome!	Reserved for PH.	M Conference	10:30 - 12:00
	Lunch on your own		12:00 - 1:15	
	Panel Session 12: Fielded Systems Andy Hess (The Hess PHM Group)	Reserved for PH.	M Conference	1:15 - 3:00
	Closing	Remarks	Location: Crestone A	3:00 - 3:30
	Continue to Enjoy DX-2016 and Denver See You in 2017 in St. Petersburg, FL!			

# 27<sup>th</sup> International Workshop on Principles of Diagnosis: DX-2016 (Held concurrently with PHM2016)

#### Session I

- Wednesday, 10:30 12:00, Room: Crestone B
  - Using Partial Diagnoses for Sequential Model-Based Fault Localization — Kostyantyn Shchekotykhin, Thomas Schmitz, Dietmar Jannach
  - Diagnosability of Discrete-Event Systems with Uncertain Observations — Xingyu Su, Marina Zanella, Alban Grastien
  - Applying Simulated Annealing to Problems in Model-based Diagnosis — Alexander Diedrich, Alexander Feldman, Alejandro Perdomo-Ortiz, Rui Abreu, Johan de Kleer, Oliver Niggemann

#### Session II

- Wednesday, 1:15 3:00, Room: Crestone B
  - Diagnosing PARC's Refrigerator Benchmark with Data-Driven Methods — Alexander Feldman, Rui Abreu, Bhaskar Saha, Anurag Ganguli, Johan de Kleer
  - An Unsupervised Approach to Anomaly Detection from Aircraft Flight Data — Daniel LC Mack, Gautam Biswas, Dinkar Mylaraswamy, Raj Bharadwaj
  - A Novel Anomaly Detection Algorithm for Hybrid Production Systems based on Deep Learning and Timed Automata — Nemanja Hranisavljevic, Oliver Niggemann, Alexander Maier

### Session III

#### Wednesday, 3:30 - 5:15, Room: Crestone B

- Minimal Hitting Set Computation via Hypothesis Exploration Marina Zanella, Ingo Pill
- Model-Based Diagnosis using Variable-Fidelity Modeling Gregory Provan
- Exploiting Structural Metrics in FMEA-Based Abductive Diagnosis — Roxane Koitz, Franz Wotawa

#### Session IV

Thursday, 10:30 - 12:00, Room: Crestone B

- A  $\pi$ -Calculus Formalization of Contract Violation Diagnosis Gianluca Torta, Roberto Micalizio
- Solving Sequential Diagnosis by Compilation to Boolean Satisfiability Ester Lazebnik, Roni Stern, Meir Kalech
- Solving Diagnosability of Hybrid Systems via Abstraction and Discrete-Event Techniques — Alban Grastien, Louise Travé-Massuyès, Vicenç Puig

#### Session V

Friday, 8:30 - 10:00, Room: Crestone B

- Diagnosability Planning for Controllable Discrete Event Systems — Hassan Ibrahim, Philippe Dague, Alban Grastien, Lina Ye, Laurent Simon
- A General Characterization of Model-Based Diagnosis Gregory Provan

#### Session VI

- Friday, 10:30 12:00, Room: Crestone B
  - Fault-Driven Minimal Structurally Overdetermined Set in a Distributed Context — Gustavo Pérez, Elodie Chanthery, Louise Travé-Massuyès, Javier Sotomayor
  - Diagnosis of Intermittent Faults with Conditional Preferences Cédric Pralet, Xavier Pucel, Stéphanie Roussel

# Job Fair

The PHM Society is holding a Job Fair within the PHM16 conference in Denver, CO. The PHM Job Fair is an exposition for PHM employers to meet with prospective job seekers. The Job Fair is FREE and OPEN to all registered PHM16 conference participants. Candidates of all ages, all levels of experience, and all industries are encouraged to attend. For further details or questions, please contact us on (need email address here). Check at Registration Desk for locations/times.

# A Short Course on PHM Fundamentals and Cases Studies

Sunday, October 1 – 2, Room: Crystal Ballroom AB Separate Registration Required

The PHM Society offers this updated two-day intensive short course titled PHM Fundamentals and Case Studies—from Monitoring/Sensing to Fault Diagnosis/Failure Prognosis and Case Studies, on PHM tools, methods, applications and case studies on October 1 and 2 in Denver USA right before the PHM16 conference. This follows from the first offering at the PHM14 conference in Fort Worth, TX with 48 attendees and ratings of 4/5. It was also run in 2015 in San Diego and 2016 in Bilbao, Spain.

This fourth offering of the course is presented by recognized experts in the PHM field and will cover the current state of the art in PHM technologies, sensors and sensing strategies, data mining tools, CBM+ technologies, novel diagnostic and prognostic algorithms as well as a diverse array of application examples/case studies. It is addressed to engineers, scientists, operations managers, educators, small business principals and system designers interested to learn how these emerging technologies can impact their work environment.

- Comprehensive introduction and two workshop sessions for detailed analysis
- Needs, Requirements and Metrics, Diagnostics, Prognostics and Data Analytics
- Condition Based Maintenance, Data Requirements, Cost Benefit Analysis and Reliability
- Seven real world case studies: aerospace bearings, batteries, data fusion, land vehicles, UAVs

Presenters from drR<sup>2</sup>, GE, Georgia Tech, NASA, Penn State, Schlumberger and TECnos

# **Doctoral Symposium**

Sunday, 1:00 – 9:00, Room: Aspen AB

Session Chairs: Jamie Coble – Univ. of Tennessee, Knoxville

The Doctoral Symposium provides an opportunity for graduate students to present their research interests and plans at a formative stage in their research. The students will receive structured guidance from a panel of distinguished researchers as well as comments from conference participants and fellow students in a collegial setting. The PHM Society Doctoral Symposium will be held as a workshop on the first two days of the conference. The panelists for the DS are:

Ravi Rajamani, *drR<sup>2</sup> Consulting* Jose Celaya, *Schlumberger* Nicholas Propes, *Seagate* Gautam Biswas, *Vanderbilt University* 

#### Doctoral Symposium Session 1

Sunday, 1:15 – 3:00, Room: Aspen AB

- Circuit Breaker Health and Reliability Monitoring: The Key to Realizing a Smarter Electricity Grid – Payman Dehghanian, *Texas A&M University*
- Algorithms for Hybrid Diagnostics of Nonlinear Systems Turki Haj Mohamad, *Villanova University*
- Fault-Tolerant Supervisory Control Mechanism for Chiller Plants – Khushboo Mittal, *University of Connecticut*

#### Doctoral Symposium Session 2

Sunday, 3:30 - 5:30, Room: Aspen AB

Bayesian Cramér-Rao Bounds for Time-of-Failure Probability

Mass Function Estimation – David Acuña, University of Chile

- Development of Deep Learning Based Approaches for Rotating Machinery Fault Diagnosis with Big Data – Miao He, University of Illinois at Chicago
- Model-Based Failure Prognosis Approach for Complex Systems to Support Asset Management – Olivier Blancke, École de Technologie Supérieure
- Toward Battery Health Management for Small-size Batterypowered Rotary-wing Aircraft – Gina Sierra, University of Chile

#### Doctoral Symposium Session 3

Sunday, 6:30 - 8:30, Room: Aspen AB

- Deep Learning Based Diagnosis of Journal Bearing Rotor Systems – Joon Ha Jung, Seoul National University
- Probabilistic Pipe Strength and Toughness Estimation through Information Fusion with Bayesian Updating – Sonam Dahire, *Arizona State University*
- Meta Learning for Fault Tolerant PHM Systems Considering Correlated Failures – Saikath Bhattacharya, *University of Massachusetts Dartmouth*

### **Tutorials**

As educational events, tutorials provide a comprehensive introduction to the state-of-the-art. Tutorials address the interests of a varied audience: beginners, developers, designers, researchers, practitioners, and decision makers who wish to learn a given aspect of prognostic health management. The tutorials will be Monday morning and are free of charge to all registrants. Tutorials will focus both on theoretical aspects as well as industrial applications of prognostics. These tutorials reach a good balance between the topic coverage and its relevance to the community.

#### **Tutorial Session 1A: Diagnostics**

Monday, 8:00 – 9:45, Room: Cripple Creek A Matthew Daigle NASA Ames Research Center Indranil Roychoudhury SGT Inc., NASA Ames Research Center

Abstract: The area of diagnostics is focused on the detection, isolation, and identification of system faults. Diagnostics is critical in guaranteeing correct, efficient, and safe operation of complex systems. In model-based diagnostics, faults are diagnosed by reasoning over a model of the system that captures both nominal and faulty behavior. While model-based diagnosis of static systems is well-established, diagnosis of dynamic systems presents a number of additional challenges, and many different approaches have been developed to handle them using different kinds of models and reasoning algorithms. This tutorial will present the general approach of model-based diagnostics, survey different fault diagnosis approaches available in literature, and present a framework for model-based diagnosis of dynamic systems. Advanced concepts of structural model decomposition and distributed diagnosis will also be presented. Case studies will be used to explain the concepts and demonstrate their application to real-world systems.

*Presenter Bios*: Matthew Daigle received the B.S. degree in Computer Science and Computer and Systems Engineering from Rensselaer Polytechnic Institute, Troy, NY, in 2004, and the M.S. and Ph.D. degrees in Computer Science from Vanderbilt University, Nashville, TN, in 2006 and 2008, respectively. From September 2004 to May 2008, he was a Graduate Research Assistant with the Institute for Software Integrated Systems and Department of Electrical Engineering and Computer Science, Vanderbilt University, Nashville, TN. During the summers of 2006 and 2007, he was

an intern with Mission Critical Technologies, Inc., at NASA Ames Research Center. From June 2008 to December 2011, he was an Associate Scientist with the University of California, Santa Cruz, at NASA Ames Research Center. Since January 2012, he has been with NASA Ames Research Center as a Research Computer Scientist. His current research interests include physics-based modeling, model-based diagnosis and prognosis, simulation, and hybrid systems. Dr. Daigle is a member of the Prognostics and Health Management Society and the IEEE.

Indranil Roychoudhury received the B.E. (Hons.) degree in Electrical and Electronics Engineering from Birla Institute of Technology and Science, Pilani, Rajasthan, India in 2004, and the M.S. and Ph.D. degrees in Computer Science from Vanderbilt University, Nashville, Tennessee, USA, in 2006 and 2009, respectively. Since August 2009, he has been with SGT, Inc., at NASAAmes Research Center as a Computer Scientist. His research interests include hybrid systems modeling, model-based diagnostics and prognostics, distributed diagnostics and prognostics, and Bayesian diagnostics of complex physical systems. Dr. Roychoudhury is a Senior Member of the IEEE and a member of the Prognostics and Health Management Society and the AIAA.

# Tutorial Session 1B: An Introduction to Data-Driven Prognostics of Engineered Systems

Monday, 8:00 – 9:45, Room: Cripple Creek B Jamie Baalis Coble University of Tennessee, Knoxville

Abstract: Approaches to prognosis of components and systems are typically divided into model-based and data-driven algorithms. Model-based algorithms rely on first principles based physics of failure models of the evolution of degradation. Data-driven methods use historic run-to-failure and accelerated degradation test data to discover the underlying relationships between measured data and equipment lifetime. Algorithms for data-driven prognostics can be categorized into three types according to the type of information used for prognosis, generally in order of greater specificity and accuracy. Type I (reliability-based) prognostics uses traditional reliability analysis to estimate the lifetime of an average component operating under average conditions. Type II (stressor-based) prognostics incorporate information about how a component or system will be operated (e.g., load, temperature, speed, pressure, demand) to evaluate the lifetime of an average component operating in some specific environment. Type III (degradation-based) prognostics track the condition of a specific component under its specific operation. This condition (or some measure indicative thereof) can be trended to failure.

This tutorial will introduce the general concept of prognostics and place it into context in a full health management system. Empirical prognostic algorithms in each of the three types will be presented.

*Presenter Bio*: Dr. Jamie Baalis Coble is an Assistant Professor in the Nuclear Engineering department at the University of Tennessee, Knoxville. Dr. Coble's expertise is primarily in statistical data analysis, empirical modeling, and advanced pattern recognition for equipment condition assessment, process and system monitoring, anomaly detection and diagnosis, and failure prognosis. Dr. Coble is currently pursuing research in prognostics and health management for active components and systems. Her research interests expand on past work in monitoring and prognostics to incorporate remaining useful life estimates into risk assessment, operations and maintenance planning, and optimal control algorithms. Prior to joining the faculty at UTK, she worked in the Applied Physics group at Pacific Northwest National Laboratory. Her work there focused primarily on data analysis and feature extraction for detecting anomalies and degradation in large passive components (e.g., concrete structures, pipes, welds), advanced active components (e.g., pumps, motors, valves), and other nuclear systems.

#### **Tutorial Session 2A: Security Prognostics**

Monday, 10:15 – 12:00, Room: Cripple Creek A Scott C. Evans

General Electric Global Research

Abstract: In this Tutorial we cast a vision for Security Prognostics (SP) for critical systems, promoting the view that security related protections would be well served to integrate fully with Monitoring and Diagnostics (M&D) systems that assess the health of complex assets and systems. To detect complex Cyber threats we propose combining system parameters already in use by M&D systems for Prognostics and Health Monitoring (PHM) with security parameters. Combining system parameters used by M&D to detect non-malicious faults with the system parameters used by security schemes to detect complex Cyber threats will improve: (a) accuracy of PHM (b) security of M&D, and (c) availability and safety of critical systems. We also introduce the notion of Remaining Secure Life (RSL), assessed based on the propagation of "security damage," to create the prospect for Security Prognostics. RSL will assist in the selection of appropriate response(s), based on breach or compromise to security component's and potential impact on system operation. An example of M&D data is provided which is normally associated with non-malicious faults providing input to detect Malware execution through time series monitoring.

*Presenter Bio*: Dr. Scott C. Evans is Senior Research Engineer in the Machine Learning Lab at General Electric Global Research in Niskayuna, NY. He has 39 patents and over 45 publications in the areas of algorithms, wind analytics, sequence analysis, cybersecurity, and wireless network routing / Quality of Service (QoS). Scott holds a PHD in Electrical Engineering from Rensselaer Polytechnic Institute, an MS in Electrical Engineering from the University of Connecticut and a BS in Electrical Engineering from Virginia Tech. Scott is currently a key contributor and machine learning task leader on a \$5.6 million IARPA program applying machine learning and causal inference to detect insider threat. Before joining General Electric Research, Scott served as a nuclear-trained Submarine Officer in the United States Navy.

#### **Tutorial Session 2B: Big Data Analytics**

Monday, 10:15 – 12:00, Room: Cripple Creek B John Patanian

General Electric Power

Abstract: Big Data is a widely used, perhaps overused term when discussing modern analytics applications. While there is a lot of hype, there are many examples of not previously feasible capabilities enabled by big data technologies, such as large scale exploratory analysis, feature engineering and predictive modeling.

In open source software, Big Data is synonymous with the Apache Hadoop tech stack. The presentation will review key analytics related components of Hadoop including HDFS, Kafka, Hive, Spark, Sqoop, Oozie, and Yarn and their function in batch, interactive, and streaming use cases. Special attention will be given to how analytics have greatly expanded in the transition to Apache Spark and the inclusion of Python and R as first class components.

The tutorial will feature an applied example where Big Data tools were used in developing an anomaly detection algorithm.

*Presenter Bio*: John Patanian is Principal Engineer, analytics for GE power and has over 20 years experience in software development, machinery diagnostics, product management, controls optimization, and thermodynamic performance. He holds a masters degree in Computer Science from the University of Washington and a Bachelor's degree in Mechanical Engineering from Rensse-

laer Polytechnic Institute. He holds two U.S. Patents and served in the ASME PTC46 committee on performance testing of Combined Cycle power plants.

# **Panel Sessions**

#### Panel Session 1: PHM For Human Assets I & II

Monday, 1:45 – 3:30 & 3:45 – 5:30, Room: Crestone A Session Chair: Wolfgang Fink – University of Arizona

Predictive Health Management (PHM) originated in the Aerospace Industry, basically trying to predict when what part would fail for what reason(s) in order to make (preventive) maintenance more efficient and cost-effective. This panel discusses contributions in the fields of wearable smart sensors, sensor-data-fusion, machine learning and data mining, prediction and diagnosis, and electronic health records and databases - all in the context of prognostics and health management for human performance on Earth and in Space. Moreover, this panel builds on the discussions of the experience and processes encountered/created by the panelists and highlights some specific challenges, needs, and wants with respect to the development and implementation of standards and guidelines pertaining to PHM in the area of human assets. This diverse group of panelists present their standards and guidelines perspectives on PHM for human assets. Conversations will include PHM's current and envisioned applications within general healthcare, theatre, and space environments along with how the needs, data stream, and supporting PHM tools, can be better designed, developed, implemented, verified, and validated to impact smart healthcare.

#### Panelists:

David Hilmers, *Baylor College of Medicine* Dorit Donoviel, *NSBRI* Col. ret. Ron Poropatich, *University of Pittsburgh* Mark Derriso, *Wright-Patterson AFB* Dragan Djurdjanovic, *University of Texas-Austin* 

#### Panel Session 2: Wind Energy

Tuesday, 8:45 – 10:15, Room: Crestone A Session Chair: Junda Zhu – NRG

The nature of the planetary section design of wind turbine gearboxes calls for the most advanced prognostics and health management solutions in hardware, software, logistics and algorithm perspective. These technology advancements require field and lab based testing along with the valuable experience from wind farm operators and maintenance practices. Moreover, due to the stochastic nature of wind speed and direction, the operating condition of wind turbine drivetrain is continuously fluctuating. Combined with the dynamic adjustment from the control system, it is a global challenge to offer robust diagnostic solutions that can provide stable and accurate readings regardless of the operating condition variation. On top of that, prognostics capability is also crucial to optimize the wind farm maintenance strategy and maximize turbine availability and production rate. Therefore, as more and more owners and operators adopting the predictive maintenance strategy, PHM technology will be an irreplaceable tool on the fleet, system and component level maintenance planning.

Panelists:

Shawn Sheng, *NREL* Zhiwei Zhang, *Romax* Alex Byrne, *DNV GL* Junda Zhu, *NRG* 

#### Panel Session 3: Oil and Gas, Exploration and Production Tuesday, 10:30 – 12:00, Room: Crestone A

Session Chair: Rune Schlanbusch – Teknova AS

As oil companies race for cost reduction, considerable work is invested in automatizing the process of drilling and production. One of their goals is to minimize the offshore crew and replace it with small crews in operations centers controlling the installations from land. Condition based maintenance is seen as an important topic towards realizing offshore autonomy without hampering risk. For efficient development, equipment groups have to be identified which leads to the most necessary and cost efficient results. The chosen monitoring technology must have strict requirements with respect to reliability and need rigorous documentation, for fitting the acceptable risk levels within the industry. Current challenges include no clear standardization and IT security.

#### Panelists:

Joseph Thorp, ARAMCO Rune Schlanbusch, Teknova AS Neil Eklund, Schlumberger Gilbert Chahine, National Oilwell Varco

Panel Session 4: Automotive PHM and Advanced Analytics Tuesday, 1:15 – 3:00, Room: Crestone A

Session Chair: Steven W. Holland – General Motors

PHM technology has entered production use in the automotive domain and is expected to become increasingly important for 1) Advanced Diagnostics and 2) True Prognostics. The scope of this panel includes the opportunities and barriers to the growth of PHM for commercial and, possibly, fleet applications. This panel is highly qualified to address the critical role suppliers will need to play in collaboration with the OEMs/Integrators to maximize the value to themselves but more importantly to the end customer. The power of Advanced Analytics further expands the scope and illustrates the paradigm shifting nature of the opportunity before us.

Panelists:

Yilu Zhang, *General Motors* Barry Einsig, *CISCO* Tim Felke, *Honeywell* Mohak Shah, *Bosch* Mircea Gradu, *Hyundai* 

Panel Session 5: PHM Education & Professional Development Tuesday, 3:30 – 5:15, Room: Crestone A Session Chairs: Jeff Bird – TECnos, Karl Reichard – Penn State

Successfully implementing PHM technologies across diverse sectors requires practitioners with multi-disciplinary knowledge and complex applications experience. The academic sector provides the bases in various specialties through degrees, certificates and short courses. Are these tools good enough to convince asset managers to develop and implement impactful PHM solutions? The PHM Society has proposed a PHM Taxonomy to define the skills and mastery levels. In addition, the Society has proposed a Continuing Professional Development scheme to guide practitioners, employers and educators.

#### Panelists:

George Vachtsevanos, Georgia Tech
Greg Kacprzynski, Impact Technologies/Sikorsky, A Lockheed Martin Company
Ravi Rajamani, drR<sup>2</sup> Consulting
Kai Goebel, NASA
Lacklan Astfalck, University of Western Australia

Panel Session 6: PHM Standards Experience for Manufacturing Wednesday, 8:45 – 10:15, Room: Crestone A

Session Chairs: Jeff Bird – TECnos. Ravi Raiamani – drR<sup>2</sup> Consulting

This panel sets the stage for beginning the PHM Society community's conversation with respect to the standards needs and wants of manufacturing stakeholders. The panel's goals are to: understand the contributions and development needs for information, guidelines and standards for PHM technologies in the aerospace sector; and how these could be the basis for other sectors, particularly the complex domain of manufacturing. First to introduce the needs and opportunities for PHM contributions to in the manufacturing sector. Then to show how information documents, recommended practices and standards have been developed systematically, for example, under SAE International HM-1 for the aerospace sector. Finally, to discuss the management of this development, and implementation process from the point of view of SAE International. Then with the audience, to identify key needs and development processes in preparation for the following Smart Manufacturing Panel.

#### Panelists:

Brian A. Weiss, NIST Ravi Rajamani, drR<sup>2</sup> Consulting Logen Johnson, SAE International

#### Panel Session 7: Smart Manufacturing PHM Wednesday, 10:30 - 12:00, Room: Crestone A

Session Organizer: Brian A. Weiss - NIST

As manufacturing environments become more complex, fault and failure opportunities increase throughout the factory. Manufacturing complexity can stem from many factors including greater flexibility and reconfigurability in manufacturing processes (to leverage new technology and/or support product customization). This complexity forces manufacturers to assess and re-assess areas of risk within their manufacturing processes. Those areas of greatest risk often become ideal targets for PHM. Including PHM (i.e., condition monitoring, diagnostics, and prognostics) can increase operational efficiency and decrease downtime. This panel both builds on the discussions of the experience and processes from the Standards Experience for Manufacturing Panel and highlights some specific challenges, needs, and wants with respect to the development and implementation of standards and guidelines with respect to PHM. This diverse group of panelists present their standards and guidelines perspectives on PHM within Smart Manufacturing. Conversations will include PHM's current and envisioned applications within factory environments along with how the needs, data stream, and supporting PHM tools, can be better designed, developed, implemented, verified, and validated to impact smart manufacturing.

#### Panelists:

David Siegel, Predictronics Tom Bugnitz, Manufacturer's Edge Al Salour, Boeing Joel Niedig, ITAMCO

#### Panel Session 8: Railway PHM

Wednesday, 1:15 - 3:00, Room: Cripple Creek B Session Chair: David Siegel - Predictronics

The maintenance strategies for rolling stock, railway infrastructure, and signaling equipment for the railway industry are moving towards a more predictive and condition based maintenance approach. With the advances in sensors, data and network infrastructure, and advanced data analytics, the railway industry has made areat strides in realizing predictive maintenance offerings and has the ability to further extend these offerings in the near future. There are numerous examples of predictive maintenance for infrastructure (track geometry/rail condition, point machines), rolling stock (brake pads, diesel engines, traction motors, wheel health, realtime monitoring /event analysis), and the panelist will discuss some of these current efforts. In addition, the panelist will discuss the current challenges (both business and technical) for developing and deploying PHM technologies in the railway industry. Lastly, some thoughts on the future direction of PHM and data analytics for the railway industry will be discussed from both the panelist and the audience members

Panelists:

Parham Shahidi, PARC Yan Liu, National Research Council Canada Pierre Dersin, Alstom Transport Zachery Gardner, VisioStack Milan Karunaratne, GE Transportation

#### Panel Session 9: Department of Defense (DoD) Condition Based Maintenance Plus (CBM+) Service Panel Review Wednesday, 1:15 - 3:00, Room: Crestone A

Session Organizers: Andy Hess – The Hess PHM Group, Greg Kilchenstein – Office of Secretary of Defense for Maintenance, Dave Cutter – Logistics Management Institute, Debbie Lilu – NCMS

A panel of Service leaders from across the Department will showcase their evolving Condition Based Maintenance Plus (CBM+) capabilities. The panelists will summarize the challenges and benefits experienced while identifying, developing, implementing, and maturing the Services' approaches to improve weapon system sustainment. This discussion will share best practices and highlight the enabling tools and technologies that are driving increased operational readiness and reduced logistics cost through more effective maintenance practices.

#### Opening Keynote Address:

Kevin Bostick, Army AMC Deputy G3/4 for Logistics Integration

#### Panel Moderator:

Greg Kilchenstein, Director, Enterprise Maintenance Technology, Office of Secretary of Defense for Maintenance

#### Panelists:

Dave Pack, Army G-44(M) CBM+ Program & Field Maintenance Debora Naguy, Air Force AFLCMC Product Support Engineering Marc Borkowski, NAVSEA 04RM Maintenance Engineering Dwayne Cole, NAVAIR CBM+ Enterprise Team

#### Panel Session 10: Select Military Maintenance Projects Funded through the Commercial Technologies for Maintenance Activities (CTMA) Program

Wednesday, 3:30 - 5:15, Room: Crestone A

Session Organizers: Andy Hess – The Hess PHM Group, Greg Kilchenstein – Office of Secretary of Defense for Maintenance, Dave Cutter - Logistics Management Institute, Debbie Lilu -NCMS

A panel consisting of industry maintenance providers will present the technology projects that have been funded and developed to address specific maintenance challenges across the Department of Defense (DoD). The panelists will discuss the development of their projects from the initial requirement and resourcing to prototyping and fielding. The scope of technologies being presented will include intermittent fault detection, maintenance inspection automation, task performance visualization, and big data analytics. This discussion will show how maintenance activities and industry participants can leverage the CTMA collaborative agreement between the DoD and the National Center for Manufacturing Sciences (NCMS) to develop critical maintenance capabilities not otherwise available. Additional project information is available at the CTMA booth in the exhibit hall.

#### Panel Moderator:

Debbie Lilu, Commercial Technologies for Maintenance Activities Program Director, National Center for Manufacturing Sciences

Panelists:

Michelle Dickey, SAS Ken Anderson, Universal Synaptics Patrick Henning, Spectro, Inc.

### Panel Session 11: Big Data Analytics

Thursday, 8:45 – 10:15, Room: Crestone A Session Chair: Jonathan Bednar – Boeing Session Organizer: Greg Bower – QorTek

Performing PHM at its basic core is collecting and analyzing data looking for and identifying trends and features that can be used to determine system health. Accomplishing PHM requires data from many different sources and thus leading data derived/driven approaches into the 'Big Data' paradigm. The Internet of Things (IoT) is an example that is fast becoming a vast land of 'Big Data' ripe for processing. A necessity is thus to efficiently process and mine the data.

The panelists in this session will describe approaches used to efficiently processes 'Big Data' in order to produce the attributes necessary for successful PHM. Current and state of the art analytic approaches will be discussed based upon the experiences of the panelist and audience. In addition, the application of cloud based computation will be discussed. Applications of discussed approaches will also be included and audience participation will focus on other potential applications and approaches.

#### Panelists:

Gregory Ditzler, *University of Arizona* Seth Deland, *MathWorks* Bill Nieman, *General Electric* Bill Roberts, *SAS* Neil Eklund, *Schlumberger* 

#### Panel Session 12: Fielded Systems

Thursday, 1:15 – 3:00, Room: Crestone A Session Chairs: Andy Hess – Hess PHM Group, Brian A. Weiss – NIST

Much can be learned from the requirements generation, development, Verification and Validation, implementation, maturation, fielded use, and fleet support of real world PHM systems. Just the development of the individual capabilities that make up a comprehensive and fully integrated PHM system; provides a large number of lessons learned - both good and bad. These need to be discussed, documented, and viewed across the many industry sectors that are fielding PHM systems.

Panelists:

Steve Holland, GM Tim Felke, *Honeywell* Pate Carini, *UTAS* 

# **Keynote Speakers**

Keynote #1: Trends and Recent Advances of Industrial Big Data Analytics and Cyber Physical Systems for PHM Applications Monday, 1:00 – 1:45 Room: Crystal Ballroom



environment, companies are facing challenges in dealing with big data issues for rapid decision making for improved productivity and business innovation. Many product and manufacturing systems are not ready to manage big data due to the lack of smart analytics tools. U.S. has been driving the Cyber Physical Systems (CPS), Industrial Internet, and Advanced Manufacturing Partnership (AMP) Program to advance future manufacturing. Germany is leading a transformation toward 4th Generation Industrial Revolution (Industry 4.0) based on Cyber-Physical Production System (CPPS). It is clear that as more predictive analytics software and embedded IoT are integrated in industrial products, predictive technologies can further intertwine smart IoT to predict product performance autonomously and further optimize the smart service systems.

The presentation will address the trends of predictive big data analytics and CPS for future industrial PHM application. First, predictive analytics and Cyber-Physical System (CPS) enabled industrial systems will be introduced. Second, advanced predictive analytics technologies for self-aware industrial systems with case studies will be presented. Finally, business innovation based on industrial big data will be introduced using case studies.

Speaker Bio: Dr. Jay Lee is Ohio Eminent Scholar, L.W. Scott Alter Chair Professor, and Distinguished Univ. Professor at the Univ. of Cincinnati and is founding director of National Science Foundation (NSF) Industry/University Cooperative Research Center (I/ UCRC) on Intelligent Maintenance Systems (www.imscenter.net) which is a multi-campus NSF Industry/University Cooperative Research Center which consists of the Univ. of Cincinnati (lead institution), the Univ. of Michigan, Missouri Univ. of S&T, and the Univ. of Texas-Austin. Since its inception in 2001, the Center has been supported by over 85 global companies including P&G, GE Aviation, Eaton, National Instruments, Boeing, GM, Ford, Chrysler, Toyota USA, Siemens, Parker Hannifin, Spirit AeroSystems, Ingersoll Rand, Intel, Applied Materials, Lam Research, Bosch Rexroth (Germany), Alstom (France), Omron (Japan), Nissan (Japan), Tekniker (Spain), FMTC (Belgium), Kistler (Switzerland), Samsung (Korea), Shanghai Electric (China), SANY (China), Baosteel (China), HIWIN (Taiwan), Foxconn (Taiwan), etc. He is the pioneer on Industrial Big Data and has authored the book "Industrial Big Data" which has been a top selling book. He was selected as 30 Visionaries in Smart Manufacturing by SME in 2016.

His current research focuses on Industrial Big Data Analytics, Cyber Physical Systems, and Self- Aware Asset Management Systems. He is one of the pioneers in the field of Intelligent Maintenance Systems, Prognostics and Health Management (PHM), as well as Predictive Analytics of Asset Management. He as mentored his students and won 1st prize of PHM Data Challenges five times since 2008. He also mentored his students and developed a spinoff company Predictronics through NSF ICorps Award in 2012. Currently, he serves on the Advisory Board for a number of start-up companies including Predictronics and Falkorny, etc.

He was invited to be a member of White House Cyber Physical Systems (CPS) American Challenge Program in Dec. 2013, a member of Technical Advisory committee (TAC) of Digital Manufacturing and Design Innovation (DMDI) in Feb. 2014, as well as a member of Leadership Council of MForesight which is a NSF/NIST Newly established manufacturing Think Tank in Sept. 2015.

He serves as a senior advisor to McKinsey & Company as well as a S&T advisor to Alstom Transport, France. In addition, he serves on the Board of Governors for Frost Sullivan Manufacturing Leadership Council, SME Smart Manufacturing Digital Transformation Executive Committee, Scientific Advisory Board of Flanders' ME-CHATRONICS Technology Centre (FMTC) in Leuven, Belgium, Scientific Committee of SIMTech of Singapore, etc. He also serves

Abstract: In today's competitive business

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Dr. Jay Lee

University of Cincinnati

as honorary professor and visiting professor for a number of institutions including Shanghai Jiao Tong Univ., Cranfield Univ. in UK, Lulea Univ. of Technology in Sweden, etc. In addition, he serves as editors and associate editor for a number of journals including IEEE Transaction on Industrial Informatics, Int. Journal on Prognostics & Health Management (IJPHM), Int. Journal on Service Operations and Informatics, etc,

Previously, he served as Director for Product Development and Manufacturing at United Technologies Research Center (UTRC), E. Hartford, CT as well as Program Directors for a number of programs at NSF during 1991-1998, including the Engineering Research Centers (ERCs) Program, the Industry/University Cooperative Research Centers (I/UCRCs) Program, and the Div. of Design, Manufacture, and Industrial Innovation. He also served as an advisory member for a number of institutions including, Johns Hopkins Univ., Cambridge Univ., etc.

He has authored/co-authored numerous highly influential articles and technical papers in the areas of Prognostics and Health Management, E-Manufacturing, Industry 4.0, and Cyber Physical Systems in Manufacturing, etc. He has over 20 patents and trademarks. He is a frequently invited speaker and has delivered over 300 invited speeches worldwide including over 200 keynote and plenary speeches at major international conferences. He is a Fellow of ASME, SME, as well as a founding fellow of International Society of Engineering Asset Management.

He has received a number of awards including the most recent Prognostics Innovation Award at NI Week by National Instruments in 2012 and NSF Alex Schwarzkopf Technological Innovation Prize and MFPT (Machinery Failure Prevention Technology Society) Jack Frarey Award in 2014.. He is also a honorary advisor to the Heifer International-a charity organization working to end hunger and poverty around the world by providing livestock and training to struggling communities.

Keynote #2: The Role of PHM at Commercial Airlines Tuesday, 12:00 – 1:15 Room: Crystal Ballroom Rhonda Walthall UTC Aerospace Sytems



Abstract: As profit margins at commercial airlines in the United states approach levels typically seen in other industries, the

airlines are starting to invest in processes that will improve operational efficiencies, improve customer satisfaction, and reduce direct operating costs. The supply of Data Analytic companies offering the capability to the provide business insight to achieve these goals is endless. With modern aircraft producing a terabyte of data on every single flight, smart sensors being installed on more and more components, and the Internet of Things ensuring more connectivity, how will the airlines use this information to achieve their operational goals? What information do they really need? Are they willing to pay for the insight?

In this presentation, Rhonda will discuss the current state of the commercial airlines, what their cost drivers are, and how PHMs can be used to lower their costs and improve their operations, assuming they are willing to pay for it.

Speaker Bio: Rhonda Walthall is the Manager of Prognostics and Health Management at UTC Aerospace Systems. Since 2010, she has led the development and implementation of the Aircraft System Health Management (ASHM) Program. Prior to joining UTC in 2003, she worked for Northwest Airlines and McDonnell Douglas Aircraft Company. Rhonda is a member of SAE International and the 2016 recipient of the James M. Crawford Technical Standards Board Outstanding Achievement Award. She is the current Chair of the newly formed Reliability, Supportability, and Health Management Systems Group, the Integrated Vehicle Health Management (IVHM) Steering Group, and the 2016 Fellows Selection Committee. She is an active member of the E32 Committee for Propulsion Systems Health Management and the HM-1 Committee for Health Management.

Rhonda was an author and contributor to the SAE publications "Integrated Vehicle Health Management: Implementation and Lessons Learned" and "Integrated Vehicle Health Management: Business Case Theory and Practice." She was a presenter in the SAE webcast "Taking Data to New Heights: How Airlines, Plane Manufacturers, and Suppliers Are Shaping the Future of Integrated Vehicle Health Management." She served as the Document Sponsor for multiple Aerospace Information Reports.

Rhonda is an active member of the Prognostics Health Management (PHM) Society, Toastmasters International, and Women in Aviation International. Rhonda holds one patent and two invention disclosures.

Rhonda received her Bachelor of Science Degree in Aeronautical and Astronautical Engineering from Purdue University and a Master's Degree in Business Administration from Pepperdine University.

Keynote #3: Testing and Debugging Software-Intensive Systems Thursday, 8:00 – 8:45 Room: Crystal Ballroom Dr. Rui Abreu PARC



Abstract: Although considerable effort has been invested in developing methods for

testing and failure detection, synthesis of programs from abstract models and verification of programs (and models), techniques for locating the root cause of observed program failures are still relatively immature. Therefore, the utility for general testing and debugging techniques remain limited to specific programs, execution environments, and problem contexts. Furthermore, no plug&play toolset exists providing state-of-the-art techniques to help developers with testing and debugging.

In this talk, we will discuss current state-of-the-art techniques for testing and debugging and how the combination of all these techniques helps to gain a better understanding of the software application. The techniques discussed in the talk are available within a plugin for the Eclipse IDE, coined GZoltar.

Speaker Bio: Dr. Rui Abreu holds a Ph.D. in Computer Science -Software Engineering from the Delft University of Technology, The Netherlands, and a M.Sc. in Computer and Systems Engineering from the University of Minho, Portugal. His research revolves around software quality, with emphasis in automating the testing and debugging phases of the software development life-cycle as well as self-adaptation. Dr. Abreu has extensive expertise in both static and dynamic analysis algorithms for improving software quality. He is the recipient of 5 Best Paper Awards, and his work has attracted considerable attention. He is currently a member of the Model-Based Reasoning group at PARC's System and Sciences Laboratory.

# **Luminary Presentations**

The Luminary sessions are tagged as a keystone event for the 2016 PHM Conference. In these sessions, experts from different domains provide new insights on the pervasive use of health management methods and technologies. In 2016, the luminary session will take place on the mornings of Tuesday, October 4 and Wednesday, October 5. These sessions are intended not only to highlight the inter-disciplinary aspect of health management, but also promote an interchange of ideas that span diverse application domains.

#### Luminary Presentation #1: Dealing with Disaster in Space and on Earth Tuesday, 8:00 – 8:45 Room: Crystal Ballroom

Dr. David C. Hilmers Baylor College of Medicine

Abstract: The Challenger accident on January 28, 1986 resulted in the first loss of life during a NASA manned spaceflight. The events leading up to this tragedy, the les-

sons learned, and my experiences as a crewmember on the return to flight mission will be discussed. After retirement from NASA and the Marine Corps, I completed medical school, residency, and became a professor at the Baylor College of Medicine in Houston, Texas. My experiences as a physician in an Ebola treatment unit in Liberia during the recent outbreak in West Africa will be described as well as current research on the prevention of and rapid response to new epidemics. The similarities of working in the remote environments of outer space and resource-poor countries will be highlighted.

Speaker Bio: Dr. Hilmers is a Professor in the Departments of Internal Meicine and Pediatrics, the Center for Space Medicine, and the Center for Global Innovation at the Baylor College of Medicine in Houston, Texas. He is board certified in both internal medicine and pediatrics. In addition to teaching, his clinical pursuits have included international HIV, pediatrics special needs, adolescent medicine, aerospace medicine, emergency medicine, tropical medicine,



nutrition, and inpatient internal medicine. His research interests include aerospace medicine, refugee health, micronutrient deficiencies, food fortification programs, disease outbreaks such as Ebola, and the influence of malnutrition on infectious diseases such as HIV and malaria. He has done international volunteer service and disaster relief work in over 50 countries and recently spent two months treating patients in an Ebola Treatment Unit in Liberia. Prior to entering medical school at the age of 42, he was a Marine Corps colonel, aviator and electrical engineer and served as a NASA astronaut on four space shuttle missions, including the first after the Challenger accident.

Luminary Presentation #2: Diagnostics with a Noisy Sensor: From Aircraft to Player Performance Wednesday, 8:00 – 8:45 Room: Crystal Ballroom Dr. Daniel Mack

Kansas City Royals

Abstract: The knowledge and experience gained in Dr Mack's projects in Diagnostics



and and Anomaly Detection for Aircraft provided a unique look at player performance analytics, that goes beyond the data-driven tools used. In this talk, Dr Mack will discuss a bit about a domain transformation that is inspired from the diagnostics work, and what the future might hold for sports analytics in this mold. With that link in place, Dr Mack will then touch upon how he would bring information back across that transformation into PHM.

Speaker Bio: Dr. Daniel Mack enters his fourth season with the Royals and second with the title of Director of Baseball Analytics/ Research Science, being promoted on January 5, 2015. He was originally hired by the organization in 2013 as an Analyst in Baseball Analytics. Mack works closely with the Baseball Analytics staff to assist with quantitative research and development of analytics in support of all areas of Baseball Operations. Prior to accepting the job with Kansas City, Mack obtained a doctorate in Computer Science from Vanderbilt University. At Vanderbilt, Mack's dissertation focused on Machine Learning and Anomaly Detection. While pursuing his doctorate, Mack worked as a research assistant at the Institute for Software Integrated Systems where he and his research group won the NASA Associate Administrator Award for Technology and Innovation for work combining machine learning with fault diagnosis. He was also a teaching assistant while completing his master's degree in computer science with a concentration in machine learning at Columbia University in New York. Mack graduated with a bachelor's degree in computer science from the University of Notre Dame in 2006. A native of Reno, Nev., he resides in Kansas City, MO.

# **Social Program**

#### Sponsor Exhibits

Monday - Thursday, Location: Crystal Ballroom Foyer

### Welcome Reception

Monday, 5:30 - 7:30, Location: Crystal Ballroom Foyer

#### Poster Reception

Tuesday, 5:30 - 7:30, Location: Crystal Ballroom

#### PHM Conference Banquet

Wednesday, 6:00 – 9:30, Location: Sports Authority at Mile High Stadium (for guest tickets, please see Registration Desk)



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# **Poster Presentations: Tuesday 5:30 – 7:30 Location: Crystal Ballroom**

#### **Doctoral Symposium Posters**

Circuit Breaker Health and Reliability Monitoring: The Key to Realizing a Smarter Electricity Grid — Payman Dehghanian, Texas A&M University Algorithms for Hybrid Diagnostics of Nonlinear Systems - Turki Haj Mohamad, Villanova University

Fault-Tolerant Supervisory Control Mechanism for Chiller Plants - Khushboo Mittal, University of Connecticut

Bayesian Cramér-Rao Bounds for Time-of-Failure Probability Mass Function Estimation - David Acuña, University of Chile

Development of Deep Learning Based Approaches for Rotating Machinery Fault Diagnosis with Big Data — Miao He, University of Illinois at Chicago

Model-Based Failure Prognosis Approach for Complex Systems to Support Asset Management - Olivier Blancke, École de Technologie Supérieure

Toward Battery Health Management for Small-size Battery-powered Rotary-wing Aircraft — Gina Sierra, University of Chile

Deep Learning based Diagnosis of Journal Bearing Rotor Systems - Joon Ha Jung, Seoul National University

Probabilistic Pipe Strength and Toughness Estimation through Information Fusion with Bayesian Updating - Sonam Dahire, Arizona State University

Meta Learning for Fault Tolerant PHM Systems Considering Correlated Failures - Saikath Bhattacharya, University of Massachusetts Dartmouth

#### PHM2016 Posters

Used Lubricating Oil Filter Debris Analysis (FDA) for Problem Diagnostic of Oil Lubricated Machinery - Dongjin Kim, Seok-Goo Kim, Jaewook Lee, Hwa Seob Song, Sang Hui Park, Joo-Ho Choi

Prognostics Data Library - developments since the European PHM conference - Joanna Sikorska, Melinda Hodkiewicz, Ashwin D'Cruz, Lachlan Astfalck, Michael Stewart, Adrian Keating

#### DX-2016 Posters

On Diagnosis of Violations of Constraints in Petri Net Models of Discrete Event Systems Using Fourier-Motzkin Method — Ahmed Al-Ajeli, Behzad Bordbar

Abductive Diagnosis Based on Modelica Models - Bernhard Peischl, Ingo Pill, Franz Wotawa

Semantics Enabled Standardized User Interfaces for Diagnosis in Modular Production Systems - Andreas Bunte, Alexander Diedrich, Oliver Niggemann

Deriving Minimal Hitting-Sets for Linear Conflict Sets - Xiangfu Zhao

Remote Fault Diagnosis of Robots Using a Robotic Black Box - Ahmad Drak, Youssef Youssef, Paul Plöger, Anastassia Kuestenmacher Anticipatory Troubleshooting - Netanel Hasidi, Roni Stern, Meir Kalech, Shulamit Reches

Comparison of Compilation Based Diagnosis Approaches: OBDD vs DNNF - Wenfeng Zhang, Bo Pang, Qi Zhao, Gan Zhou, Xiumei Guan, Wenguan Feng

Belief Management using the Action History and Consistency-Based-Diagnosis - Clemens Mühlbacher, Gerald Steinbauer

Water Management in a Peri-Urban Region in India: Designing a Model Library for Process-oriented Diagnosis and Decision Support - Peter Struss, Franziska Steinbruch, Christoph Woiwode

Definition of Model-based Diagnosis Problems with Altarica - Yannick Pencolé, Elodie Chanthery, Thierry Peynot

Franz Wotawa

Dynamic Clustering as a Tool for Monitoring Evolving Systems — Nathalie Barbosa Roa, Louise Travé-Massuyès, Victor Hugo Grisales Palacios Unification of Leaky Noisy OR and Logistic Regression Models and Maximum A Posteriori Inference for Multiple Fault Diagnosis Using the Unified Model — Ali Abdollahi, Krishna Pattipati

Sequential Scheduling of Observations in Diagnosis of Continuous Dynamic Systems - Roberto Zanotti, Alexander Feldman, Marina Zanella, Johan de Kleer

Sequential Plan Recognition — Reuth Mirsky, Kobi Gal, Roni Stern, Meir Kalech

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PHM 2017 Planning Meeting: Thursday, October 6<sup>th</sup> 10:30 – 12:00 Crestone A



# *PHM 2017 St. Petersburg, FL, October 2 – 5, 2017*



Ninth Annual Conference of the Prognostics and Health Management Society Hilton St. Petersburg Bayfront Hotel, St. Petersburg, Florida

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- PHM Sensors and Devices
- Fault-Adaptive Control Methods
- Physics of Failure Mechanisms
- · Modeling and Simulations
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- PHM for Energy Applications
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