

## IFC-Bank of Italy workshop on "Data science in central banking"

### Part 2: Data Science in Central Banking: Applications and tools

14-17 February 2022, BIS Basel, virtual event

## Programme<sup>1</sup>

### Day 1: 14 February 2022

<i>Time (CET)</i>	<i>Topic</i>	<i>Presenter marked in bold</i>
13:00 – 13:10	Welcome remarks	<b>Rashad Cassim</b> , Deputy Governor of the South African Reserve Bank and Chair of the Irving Fisher Committee on Central Bank Statistics (IFC)
13:10 – 13:40	<b>Keynote speech:</b> Artificial Intelligence in Finance - Quo Vadis	<b>Joerg Osterrieder</b> , Professor of Finance and Artificial Intelligence, ZHAW School of Engineering, Switzerland, University of Twente, Netherlands
13:40 – 13:45	Data Science in Central Banking – Comments from BIS' Innovation Hub perspective	<b>Ross Leckow</b> , Head of BIS Innovation Hub
13:45 – 15:00	<b>Session 1.1 – Network Analysis for Financial Stability Oversight</b>	Chair: <b>Giuseppe Bruno</b> , Bank of Italy
	<ul style="list-style-type: none"> <li>A multi-layer dynamic network for significant European banking groups</li> </ul>	<b>Annalaura Ianiro</b> and <b>Joerg Reddig</b> , European Central Bank
	<ul style="list-style-type: none"> <li>A Network Analysis of the JGB Repo Market</li> </ul>	<b>Yasufumi Gemma</b> , Bank of Japan
	<ul style="list-style-type: none"> <li>Data science and Statistics: a network analysis to understand the foreign investment</li> </ul>	<b>João Falcão Silva</b> , Banco de Portugal, Bojan Stavrik and Flávio Pinheiro, NOVA Information Management School
	<ul style="list-style-type: none"> <li>Understanding the Patterns of Financial Crimes and Financial Institutions' Exposure to These Patterns using Network Analysis and NLP</li> </ul>	<b>Yan Ling Lee</b> and <b>Farah Hani Abd Nasir</b> , Central Bank of Malaysia

<sup>1</sup> Timing: 15 minutes per presentation, including 2 minutes Q&A.

	<ul style="list-style-type: none"> <li>Cross-Currency Swap Market through the Lens of OTC Derivative Transaction Data – Impact of COVID-19 and Subsequent Recovery</li> </ul>	<b>Kazuaki Washimi</b> , Bank of Japan
15:00 – 15:45	<b>Session 1.2 – Sentiment analysis in economic and monetary research</b>	Chair: <b>Giuseppe Bruno</b> , Bank of Italy
	<ul style="list-style-type: none"> <li>Sentiment Analysis of Tourist Reviews from Online Travel Forum for Improving Indonesia Tourism Sector</li> </ul>	<b>Muhammad Abdul Jabbar, Anggraini Widjanarti</b> , Arinda Dwi Okfantia and Alvin Andhika Zulen, Bank Indonesia
	<ul style="list-style-type: none"> <li>Extracting Economic Sentiment from News Articles: The Case of Korea</li> </ul>	<b>Younghwan Lee</b> and Beomseok Seo, Bank of Korea
	<ul style="list-style-type: none"> <li>Measuring Text-based Sentiments from Monetary Policy Statements – A Malaysian Case Study using Natural Language Processing</li> </ul>	<b>Sui-Jade Ho</b> and Eilyn Chong, Central Bank of Malaysia
15:45	Close of day 1	

Day 2: 15 February 2022

<i>Time (CET)</i>	<i>Topic</i>	<i>Presenter marked in bold</i>
13:00 – 15:00	<b>Session 2.1 – NLP and ML techniques supporting Central Bank Operations</b>	Chair: <b>Douglas Araujo</b> , Bank for International Settlements
	<ul style="list-style-type: none"> <li>Mailbot – optimising the process of answering statistical queries</li> </ul>	<b>Gavril Petrov</b> , Daphne Aurouet, Nina Blatnik, Samo Boh, Andrea Colombo, Almir Delic, Jordi Gutiérrez and Kristine Rikova, European Central Bank
	<ul style="list-style-type: none"> <li>Central bank communication: what can a machine tell us about the art of communication?</li> </ul>	Joan Huang and <b>John Simon</b> , Reserve Bank of Australia
	<ul style="list-style-type: none"> <li>News and banks' equities: do words have predictive power?</li> </ul>	Valerio Astuti, <b>Giuseppe Bruno</b> , Sabina Marchetti and Juri Marcucci, Bank of Italy
	<ul style="list-style-type: none"> <li>Natural Language Processing for Risk Management</li> </ul>	<b>Bijan Sahamie</b> , Deutsche Bundesbank
	<ul style="list-style-type: none"> <li><i>gingado</i>: a machine learning library focused on economics and finance</li> </ul>	<b>Douglas Araujo</b> , Bank for International Settlements
	<ul style="list-style-type: none"> <li>Integrating Natural Language Processing Technologies to Central Bank Operations at Bank of Thailand</li> </ul>	<b>Pucktada Treeratpituk</b> and Jiradett Kedsri, Bank of Thailand
	<ul style="list-style-type: none"> <li>Evaluating Mobile Money Access and Use with Non-traditional Data Sources</li> </ul>	<b>Kazuko Shirono</b> and Ayoub Mharzi, International Monetary Fund
	<ul style="list-style-type: none"> <li>Machine Learning for Measuring Central Bank Credibility and Communication</li> </ul>	<b>Okiriza Wibisono</b> , Muhammad Abdul Jabbar and Anggraini Widjanarti, Bank Indonesia
15:00 – 15:45	<b>Session 2.2 – Business Intelligence tools supporting Data Analysis and Quality Control</b>	Chair: <b>Douglas Araujo</b> , Bank for International Settlements
	<ul style="list-style-type: none"> <li>Interactive Visualization Tool: Outlier detection in large multidimensional datasets</li> </ul>	<b>Philipp Reisinger</b> , Thomas Kemetmueller and Christoph Leitner, National Bank of the Republic of Austria
	<ul style="list-style-type: none"> <li>Spot the flaw – Using Power BI for quality control: an application to non-financial corporations' data</li> </ul>	<b>José Alexandre Neves, Tiago Pinho Pereira</b> and Ana Bárbara Pinto, Banco de Portugal
	<ul style="list-style-type: none"> <li>Leveraging the power of visualization for data exploration and insights communication - Visual Analytics with Tableau</li> </ul>	<b>Zunaira Rasheed</b> , Bank for International Settlements

15:45 – 16:30	<p><b>Session 2.3 – Data Quality Assurance supporting Central Bank Operations</b></p>	<p>Chair: <b>Bruno Tissot</b>, Bank for International Settlements</p>
<ul style="list-style-type: none"> <li>• Anomaly intersection: disentangling data quality and financial stability developments in a scalable way</li> </ul>		<p>Gemma Agostoni (ECB), Louis de Charsonville (McKinsey &amp; Company), Marco D’Errico (ECB, ESRB Secretariat), Cristina Leone (BIS), <b>Grzegorz Skrzypczynski</b> (ECB)</p>
<ul style="list-style-type: none"> <li>• Introducing interactive feedback loops in statistical production systems</li> </ul>		<p><b>Georgios Kanellos, Carlos Mougan</b>, Thomas Gottron, Johannes Micheler and José Martínez, European Central Bank</p>
<ul style="list-style-type: none"> <li>• Stacking machine-learning models for anomaly detection: comparing AnaCredit to other banking datasets</li> </ul>		<p><b>Pasquale Maddaloni</b>, D N Continanza, A del Monaco, M di Lucido, D Figoli, F Quarta and G Turturiello, Bank of Italy</p>
16:30	Close of day 2	

Day 3: 16 February 2022

<i>Time (CET)</i>	<i>Topic</i>	<i>Presenter marked in bold</i>
13:00 – 14:30	<b>Session 3.1 – Modern Data Architectures and Tools (I)</b>	Chair: <b>Bruno Tissot</b> , Bank for International Settlements
	<ul style="list-style-type: none"> <li>Swimming in the Data Lake: An application to NielsenIQ Homescan</li> </ul>	<b>Minnie H Cui</b> , Bothale Mosweu and Gene (Fa Gui) Jiang, Bank of Canada
	<ul style="list-style-type: none"> <li>Implementing a multi-tenant Big Data platform – Challenges and approaches taken in the BIS</li> </ul>	Hiren Jani and <b>Anand Kannan</b> , Bank for International Settlements
	<ul style="list-style-type: none"> <li>Modern Computing Platforms as key Central Banking Technology</li> </ul>	<b>Jochen Papenbrock</b> , NVIDIA GmbH
	<ul style="list-style-type: none"> <li>The Data Analytics Lab – from innovation to products</li> </ul>	Hiren Jani, <b>Mathieu Le Cam</b> and Mona Amer, Bank for International Settlements
	<ul style="list-style-type: none"> <li>Containerization for Research Collaboration: Platform Independent Economics</li> </ul>	<b>Venkat Balasubramanian</b> , Bank of Canada, <b>Danielle Handel</b> , Stanford University and <b>Carson Rea</b> , Emory University
14:15 – 15:30	<b>Session 3.2 – Modern Data Architectures and Tools (II)</b>	Chair: <b>Rafael Schmidt</b> , Bank for International Settlements
	<ul style="list-style-type: none"> <li>Strategy for the adoption of a Modern Data Architecture in Banco de Portugal</li> </ul>	<b>Caio Costa</b> , <b>Guilherme de Sousa</b> and Hugo Matos, Banco de Portugal
	<ul style="list-style-type: none"> <li>Microdata utility – data loading with automated data parsing and data structure creation</li> </ul>	<b>Marcus Jellinghaus</b> , Bank for International Settlements
	<ul style="list-style-type: none"> <li>Data governance In Russian credit information industry</li> </ul>	<b>Andrey Akhramenov</b> , Central Bank of the Russian Federation
	<ul style="list-style-type: none"> <li>Defining business transformation rules in a standardised format – a practical case</li> </ul>	<b>Daniela Arru</b> and Giulia Oddone, European Central Bank
	<ul style="list-style-type: none"> <li>EU Single Resolution Board system for data collection, transformation and analysis</li> </ul>	<b>Michal Piechocki</b> , Marta Kuczyńska and Karol Minczyński, Business Reporting - Advisory Group (BR-AG)

15:30 – 16:00	<b>Session 3.3 – Leveraging Big and Alternative Data</b>	Chair: <b>Rafael Schmidt</b> , Bank for International Settlements
<ul style="list-style-type: none"> <li>• Big Data Analytics on Payment System for Measuring Household Consumption Indicator in Indonesia</li> </ul>		<b>Alvin Andhika Zulen, Mohammad Khoyrul Hidayat</b> and Muhammad Abdul Jabbar, Bank Indonesia
<ul style="list-style-type: none"> <li>• Using Non-traditional Point of Interest Data as Merchant Survey Sample Frames</li> </ul>		<b>Joy Wu</b> , Angelika Welte, Bank of Canada, and Marcel Voia, University of Orléans
16:00	Close of day 3	

Day 4: 17 February 2022

Time (CET)	Topic	Presenter marked in bold
13:00 – 14:00	<b>Session 4.1 – Nowcasting Economic Activity</b>	Chair: <b>Juri Marcucci</b> , Bank of Italy
	<ul style="list-style-type: none"> <li>Now-casting business and financial cycles using low- and high-frequency data</li> </ul>	<b>Alberto Americo, Frederik Hering and Rukmani Vaithianathan</b> , Bank for International Settlements
	<ul style="list-style-type: none"> <li>Nowcasting Economic Activity with Mobility Data</li> </ul>	<b>Koji Takahashi</b> , BIS, and Kohei Matsumura, Yusuke Oh and Tomohiro Sugo, Bank of Japan
	<ul style="list-style-type: none"> <li>Big Data Analytics on Real Time Gross Settlement Data for Tracking Corporate Activity</li> </ul>	<b>Amin Endah Sulistiawati</b> , Mohammad Khoyrul Hidayat and <b>Alvin Andhika Zulen</b> , Bank Indonesia
	<ul style="list-style-type: none"> <li>Economic monitoring in Covid-19 period: the contribution of high frequency indicators</li> </ul>	<b>Coffinet Jérôme</b> , Jean-Brieux Delbos, Kaiser Vojtech, Jean-Noël Kien, Étienne Kintzler, Ariane Lestrade, Michel Mouliom and Théo Nicolas, Bank of France
14:00 – 14:45	<b>Session 4.2 – VAR/VECM techniques in Economic and Financial Analysis</b>	Chair: <b>Juri Marcucci</b> , Bank of Italy
	<ul style="list-style-type: none"> <li>What should be the optimal financial structure of the FDI inflows to Poland in stimulating growth processes?</li> </ul>	<b>Aneta Kosztowniak</b> , Narodowy Bank Polski
	<ul style="list-style-type: none"> <li>Deep Vector Autoregression for Macroeconomic Data</li> </ul>	Marc Agustí, <b>Patrick Altmeyer</b> and Ignacio Vidal-Quadras Costa, Delft Technical University (ECB)
	<ul style="list-style-type: none"> <li>Changes in the lending activity of banks in Poland, including the portfolio of corporate loans</li> </ul>	<b>Aneta Kosztowniak</b> , Narodowy Bank Polski
14:45 – 15:15	<b>Session 4.3 – Text mining and ML utilized in Economic Research</b>	Chair: <b>Juri Marcucci</b> , Bank of Italy
	<ul style="list-style-type: none"> <li>A Machine Learning Approach to Narrative Retrieval in Economic News: The Case of Oil Price Uncertainty</li> </ul>	<b>Donald Jay Bertulfo</b> , Delft University of Technology
	<ul style="list-style-type: none"> <li>A web application prototype to retrieve sustainability information from unstructured text (non-financial corporation annexes)</li> </ul>	<b>Alejandro Morales and Eugenia Koblents</b> , Bank of Spain
15:15 – 15:30	Closing remarks	<b>Piero Cipollone</b> , Deputy Governor of the Bank of Italy
15:30	End of workshop	

