

# **ML/FIN EXCHANGE RATE:**

MATHEMATICAL INSIGHTS FROM MARKETS, CONTROL, AND LEARNING.

### **Abstract**

Despite their undeniable success in recent decades, conventional models in financial mathematics require knowledge of the parameters of a model which is often lacking in practice. The use of machine learning (ML) offers immense potential to address this gap by enabling more accurate modelling of financial markets and more informed decision-making.

On the other hand, the wide range of problems studied in financial mathematics, such as optimal execution and portfolio management, has begun attracting the interest of researchers in learning theory. Furthermore, the advanced mathematical tools traditionally used in financial mathematics are now contributing to several notable advances in learning theory and its recent applications, such as *diffusion models*.

Therefore, it is evident that these two communities are complementary in many respects, and interdisciplinary collaborations between them should be promoted. This workshop aims to bring together young researchers from these two fields to share their ideas, challenges, and methods, thereby building interdisciplinary bridges that will open exciting new perspectives in the fields of mathematical finance and machine learning.

## **Sponsors**











## **CONFERENCE PRESENTATION**

#### Related events

The recent interest in ML for finance has led to several events in recent years. There have been several single-day workshops, at Machine learning conferences such as <a href="KDD">KDD</a> (August 2023), or at research institutions such as <a href="Imperial College London">Imperial College London</a> (March 2023). These events have generally focused on research talks and provided only limited opportunities for researchers to build collaborations in person, due to their short duration. In contrast, there have been several summer schools on the topics of machine learning and finance outside of France, such as at <a href="Oxford">Oxford</a> (July 2023), or <a href="Gaeta">Gaeta</a> (May 2024). Unfortunately, no such school has taken place in France recently to the best of our knowledge.

This lack of venues for young researchers, particularly in France, hampers the ability of researchers to create effective networks of collaboration and develop interdisciplinary knowledge and skills early in their career. At the same time, France's rich network of leading institutions in Finance and Machine Learning research has an undeniable potential to support long term collaborative efforts through initiatives like this workshop aimed at young researchers.

## Organisation Committee

- Lorenzo Croissant, postdoc, CREST, ENSAE, and Inria, FairPlay team.
- Antonio Ocello, postdoc, CMAP, Ecole Polytechnique.
- Grégoire Szymanski, PhD student, CMAP, Ecole Polytechnique.

#### Scientific Committee

- Samuel Cohen, Professor, University of Oxford.
- Christa Cuchiero, Professor, Universität Wien.
- Charles-Albert Lehalle, Global Head of Quantitative R&D, Abu Dhabi Investment Authority.
- Eric Moulines, Professor, CMLA, Ecole Polytechnique.
- Vianney Perchet, Professor, CREST, ENSAE.
- Huyên Pham, Professor, LPSM, Université Paris Cité.

## **CONFERENCE DETAILS**

The workshop will take place over from Monday 23/09/2024 (arrival Sunday 22/09/2024) to Friday 27/09/2024 (ending at lunch time) at the <u>Centre Paul Langevin</u> in Aussois, in the French Alps. We aim to welcome 30 participants at an early stage of their academic career (PhD, Postdoc, and young permanent researchers) from a range of backgrounds.

#### Conference Venue

The workshop will take place at the <u>Centre Paul Langevin</u>, a mountain hotel under the purview of the CNRS. It is accessible by

## **Applications**

To ensure the scientific excellence of the workshop, we will take applications from prospective attendees on the basis of the call for contributions below. The organisation committee will shortlist applications based on relevance of work to the conference, under the supervision of the scientific committee. Places will be allocated according to the shortlist with priority given to selected speakers.

Particular care will be taken to encourage the applications of researchers from backgrounds underrepresented in the fields, such as women, applicants from non-standard career paths, or applicants from regions peripheral to the western academic environment.

#### Call for contributions

The mathematical insights from markets, control, and learning workshop is an interdisciplinary workshop for young researchers in financial mathematics, machine learning and adjacent fields within mathematics, computer science, and economics.

We invite applications from researchers of all backgrounds at early stages in their careers (PhD, postdoc, recent faculty/researchers). Applicants are encouraged to submit a contribution to the conference (talk and/or poster) in the form of an abstract, and priority will be given to contributing applicants within the limits of capacity.

Contributions may present original or published research on topics including (but not limited to)

- Theoretical study of markets (e.g. auction theory, matching, market design)
- Empirical study of markets (e.g. market microstructure, volatility models, non-standard markets)
- Financial decision problems (e.g. portfolio management, optimal execution)
- General theory of decision problems (e.g. optimisation, control, game theory)
- General theory of stochastic analysis (e.g. SDEs, Hawkes processes, rough path)
- Applications of machine learning methods to financial problems
- General theory of learning (e.g. reinforcement learning, algorithms with predictions)
- Issues of fairness, privacy, or transparency or other social and economic considerations regarding markets (e.g. dark pools, financial data privacy)
- Theory of fairness and privacy.

Contributions which do not fit neatly into one of the above categories are nonetheless encouraged and will be equally considered. Contributions which feature an interdisciplinary connection between two or more of these themes are especially encouraged.

# **CONFERENCE ORGANISATION**

#### Finances

To be able to welcome Ph.D. students regardless of funding situation, we aim to finance the fees of the stay of all attendees. Any further funding will be used to support further participants, up to the limit imposed by accommodation (50) and to support travel expenses of students in need.

We solicit funding from interested sponsors, both academic and private to cover these expenses. Funds will be centralised at Ecole Polytechnique and finances will be managed by Justine Viaud, general secretary of CREST.

Sponsorships will be recognised in the advertising materials to attendees, including recognition during the opening of the conference. A report summarizing all the talks and events of the conference will be produced and distributed to sponsors after the workshop. We will also support and participate in other outreach efforts of sponsors, for instance with photographs of the event. Further, we welcome participants from our sponsors to give talks on topics (theoretical or practical) of interest to them.

## Budget plan

Below is a list of expected expenditure and funding sources of the conference, to be revised as organisation progresses. The following table contains expenditures, estimated based on the cost of board at CIRM for 5 nights and 5 days (Sunday-Friday). These expenditure estimates have not been incurred at this stage and may vary due to availability of accommodation.

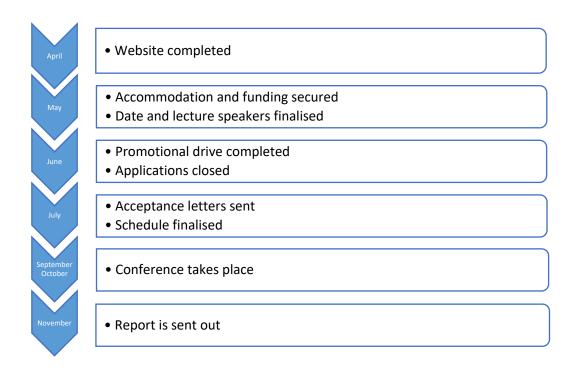
| Expense                    | Number of units | Unit cost | Total cost |
|----------------------------|-----------------|-----------|------------|
| Accommodation at CIRM/CAES | 30              | 575,00 €  | 17.250,00€ |
| Total                      | 17.250,00€      |           |            |

The following table contains cash inflows by source of funding, and includes funding already secured (indicated by "Secured" in the "Status" column), and funding which has been requested but is not confirmed (indicated by "Pending" in the "Status" column). An eventual shortfall on requested funds will be made up by additional funding obtained through grants, or through funding by research chairs and academic institutions.

| Nature of<br>Funding | Source   | Contact                | Institution                                      | Value     | Status  |
|----------------------|--|------------------------|--|-----------|---------|
| Grant                | BOUM   |                        | SMAI   | 1000,00€  | Secured |
| Direct<br>funding    | Futures of quantitative finance Chair                          | Huyên<br>Pham          | Fondation des<br>Ponts                           | 5000,00€  | Secured |
| Grant                | Soutien aux<br>manifestations<br>scientifiques                 |                        | Fondation<br>Mathématique<br>Jacques<br>Hadamard | 3000,00€  | Secured |
| Direct<br>funding    | Programme de<br>mécénat<br>« Deep<br>Finance &<br>Statistics » | Stefano<br>De<br>Marco |  | 5000,00€  | Secured |
| Direct<br>funding    |  | Grégoire<br>Allaire    | СМАР   | 5000,00€  | Secured |
| Total                |  |                        |  | 19000,00€ |         |

# Timeline

Below is an estimated organizational timeline, indicating milestones to be reached by the end of the corresponding month.



## **SCIENTIFIC PROGRAM**

#### Overview

The workshop focuses on interdisciplinary contributions at the intersection of Applied and Financial Mathematics, Statistics, Economics, and Computer Science, welcoming both theoretical and empirical work. The objective is to build bridges between these communities at the level of young researchers to forge connections that will drive interdisciplinary research forward in the future.

We hope theorists can recognise tools and problems of shared interest across disciplinary boundaries as well as draw on real-world problems to inspire their work. Conversely, we hope applied researchers can find theoretical guidance and practical expertise for their problems and propose new problems which spur the theoretical fields forwards. To realise this vision, we have centred the scientific program around 5 sessions each of which straddles disciplinary boundaries while also engaging in a dialogue with other sessions.

## Economic theory of markets

This session delves into the foundational theories underpinning market dynamics, including auction theory, market design, and matching algorithms. Researchers will explore the theoretical frameworks governing market equilibrium, price discovery mechanisms, and

allocation efficiency in various market structures. Discussions will encompass the intricacies of auction mechanisms, the design of market platforms, and the role of matching algorithms in optimizing resource allocation. Through mathematical analyses of theoretical models, participants will uncover insights into market efficiency, liquidity provision, and the impact of market microstructure on price formation. These theoretical insights, leveraging mostly Economics and Computer Science tools should provide the basis of comparison with real-world market situations.

## Markets in the real world

This session focuses on the empirical realities and statistical phenomena observed in real-world markets, encompassing diverse financial instruments as well as markets lying outside traditional financial domains. Topics include market microstructure dynamics, statistical properties of asset returns, and the influence of exogenous factors on market behaviour. Case studies will explore the intricacies of trading in non-financial markets, such as commodities, energy, and advertising, and shed light on the challenges posed by various aspects of market structure (auction format, regulatory environments, etc.). Traditional mathematical finance will find new, exotic markets which welcome its mature tools, while also shedding new light on the influence of the market format via comparative analysis.

## Learning to Control

This session, dedicated to control problems, explores innovative approaches to resolving control problems in dynamic environments with imperfect knowledge or uncertain models. Researchers will discuss advancements in control theory, reinforcement learning theory, and adaptive control strategies. Topics range from theory to applications within the context of financial decision-making and may include the resolution of control problems under model uncertainty, reinforcement learning techniques for trading algorithms, and the development of robust control policies in uncertain market conditions. This session aims for the mutually beneficial convergence of expertise between theoreticians and practitioners of both control theory and reinforcement learning.

# Integrating ML in decision problems

This session focuses on machine learning techniques which, unlike in reinforcement learning, do not learn from interactions with the decision problem but, instead, learn from prior data to predict key variables of interest in the decision problem.

Many practical approaches to integrating ML in decision problems involve using available data to learn to predict important variables of the decision problem, which are then fed to a (non-ML) decision maker. This session is dedicated to this perspective, sometimes known as algorithms with predictions and is a counter point to the session on learning to control.

Researchers will present case studies showcasing the use of machine learning algorithms to forecast market parameters and inform investment decisions, as well as learning-theoretic explorations of this problem. Practitioners will be exposed to the key concepts of the budding theoretical basis for this approach, while theorists will be presented with a range of new problems to guide their study.

## Fairness, privacy, and transparency in markets

Ensuring fairness, privacy, and transparency in financial markets is paramount for maintaining market integrity and public trust. This session examines the ethical, policy, and regulatory considerations surrounding data privacy, algorithmic bias, and market transparency in financial markets, in both theoretical and real-world markets. Researchers will discuss methodologies for detecting and mitigating biases in algorithmic decision-making, safeguarding sensitive financial information, and promoting equitable market access. Through interdisciplinary discussions, participants will explore the implications of emerging technologies on market fairness and transparency, and the role of regulatory frameworks in fostering trust and accountability in financial markets.

## Program

To foster collaboration and discussion, we will host three types of talks broken up by many short breaks, namely:

- 5 Introductory courses (one for each thematic session) each consisting of 3 lectures of 45 minutes each.
- 7 Spotlight talks dedicated to exemplary interdisciplinary work or industry relevant problems lasting 45 minutes each (35m talk, 10m questions).
- 20 Short talks with posters encouraged, lasting 20 minutes each (15m talk, 5m questions).

Below is a draft schedule of the arrangement of the talks. Specific talks will be placed in the schedule based on speaker constraints, and wherever possible lectures in a session will precede the spotlights and short talks associated.

|             | Monday                     | Tuesday               | Wednesday             | Thursday              | Friday                |
|-------------|----------------------------|-----------------------|-----------------------|-----------------------|-----------------------|
| 8:30-9:15   | Opening Course 1 Lecture 1 | Course 2<br>Lecture 1 | Course 3<br>Lecture 2 | Course 4<br>Lecture 2 | Course 5<br>Lecture 3 |
| 9:15-9:30   | Break                      |                       |                       |                       |                       |
| 9:30-10:15  | Course 1<br>Lecture 2      | Course 2<br>Lecture 2 | Course 3<br>Lecture 3 | Course 4<br>Lecture 3 | Spotlight             |
| 10:15-10:45 | Break                      |                       |                       |                       |                       |
| 10:45-11:30 | Spotlight                  | Spotlight             | Short Talks           | Spotlight             | Short Talks           |
| 11:30-11:45 | Break                      |                       |                       |                       |                       |
| 11:45-12:30 | Short Talks                | Short Talks           | Course 4              | Short Talks           | Short Talks           |
| 42.20.44.00 | Lecture 1 Closing          |                       |                       |                       | Closing               |
| 12:30-14:00 | Course 1<br>Lecture 3      | Course 2<br>Lecture 3 | Lunch                 | Course 5<br>Lecture 1 |                       |
| 14:45-15:00 | Break                      |                       |                       | Break                 | 1 - 0 0               |
| 15:00-15:45 | Spotlight                  | Spotlight             | Left free             | Course 5<br>Lecture 2 | Left free<br>for      |
| 15:45-16:15 | Break                      |                       | for                   | Break                 | return                |
| 16:15-17:00 | Short Talks                | Short Talks           | activities            | Spotlight             | travel                |
| 17:00-17:15 | Break                      |                       |                       | Break                 |                       |
| 17:15-18:00 | Short Talks                | Course 3<br>Lecture 1 |                       | Short Talks           |                       |

# **POTENTIAL SPEAKERS LIST**

## Introductory courses

### 1. Economic theory of markets,



Simon Mauras is a permanent researcher at INRIA, in the <u>FAIRPLAY</u> team, working on topics of Mechanism Design, auctions and Fairness. Prior to this position, he was a postdoctoral Fellow at Tel Aviv University, working on algorithmic Mechanism Design. He holds a Ph.D. in Computer Science from IRIF and Université Paris Cité, under the supervision of Claire Mathieu.



Flore Sentenac is an Assistant Professor in the Information Systems and Operations Management department at HEC Paris. Her research focuses on online learning algorithms and matching with applications in digital advertising. She holds a Ph.D. in Applied Mathematics from ENSAE, under the supervision of Vianney Perchet.

#### 2. Markets in the real-world,

To be announced.

#### 3. Learning to control,



Lorenzo Croissant is currently a postdoctoral researcher at ENSAE working on topics in control and learning theory, as part of the <a href="#">FAIRPLAY</a> INRIA team. He holds a Ph.D. in Applied Mathematics from Université Paris-Dauphine, under the supervision of Bruno Bouchard and Marc Abeille.

### 4. ML in decision problems,

To be announced.

#### 5. Fairness, privacy, transparency in markets,



Felipe Garrido-Lucero is currently a postdoctoral researcher in Market design & Fairness at <u>FAIRPLAY</u>, joint team between INRIA, IP Paris (ENSAE and Ecole Polytechnique), and Criteo. He defended his Ph.D. in Computer Science in 2022 at Université Paris-Dauphine, under the supervision of Rida Laraki.



Solenne Gaucher is currently a postdoctoral researcher in sequential learning, sequential decision-making problems, and fair machine learning at CREST, as part of the <u>FAIRPLAY</u> INRIA team. She holds a Ph.D. in Statistics from Université Paris-Saclay, under the supervision of Christophe Giraud and Olga Klopp.

### **Potential Attendees**

A non-exhaustive list of researchers which fall within the purview of the conference and will be invited to apply.

| Name                  | Affiliation                   | Name                | Affiliation                        |
|-----------------------|-------------------------------|---------------------|------------------------------------|
| Morgane Goibert       | CFM                           | Shaun Li            | Université Paris-<br>Dauphine, AXA |
| Solenne Gaucher       | ENSAE                         | Louis Armand Gerard | Université Paris I,<br>GEFIP       |
| Matilde Tullii        | ENSAE                         | Songbo Wang         | Ecole Polytechnique                |
| Maria Cherifa         | ENSAE, Criteo                 | Assil Fadle         | Ecole Polytechnique                |
| Emanouil Sfendourakis | Ecole Polytechnique           | Redouane Silvente   | Ecole Polytechnique                |
| Alexander Merkel      | TU Berlin                     | Fanny Cartellier    | ENSAE                              |
| Timothée Fabre        | École Centrale, Sun Zu<br>Lab | Alicia Bassière     | ENSAE                              |
| Vincent Ragel         | Ecole Centrale                | Jodi Dianetti       | Universität Bielefeld              |

| Nathan De carvalho | Université Paris-Cité,<br>Engie            | Maximilien Germain    | Morgan Stanley                         |
|--------------------|--|-----------------------|--|
| Jules Delemotte    | Ecole Polytechnique                        | Alessio Brini         | Duke University                        |
| Siu Hin Tang       | NUS  | Felix Prenzel         | University of Oxford                   |
| Adele Ravagnani    | SNS Pisa                                   | Chao Zhang            | University of Oxford                   |
| Paul Hager         | Humboldt Universität                       | Ioannis Gasteratos    | Imperial College<br>London             |
| Florin Suciu       | Université Paris-<br>Dauphine              | Carl Remlinger        | EPFL                                   |
| Janka Möller       | Universität Wien                           | Melih İşeri           | University of Michigan                 |
| Steven A. Campbell | Columbia University                        | Jiacheng Zhang        | University of<br>California at Berkely |
| Purba Das          | King's College London                      | Antoine Heranval      | ENSAE                                  |
| Gökce Dayanikli    | University of Illinois<br>Urbana-Champaign | Victor Le Coz         | Ecole Polytechnique,<br>Quant Al Lab   |
|                    | Université Paris-<br>Dauphine              |                       | University of Oxford                   |
| Claire Vallade     | Banque de France                           | Wei Xiong             |  |
| Flore Sentenac     | HEC  | Simon Mauras          | INRIA                                  |
| Simon Finster      | INRIA                                      | Felipe Garrido-Lucero | INRIA                                  |
| Etienne Boursier   | Université Paris-Saclay                    | Giovanni Montanari    | ENSAE                                  |
| Giulia Romano      | Politechnico di Milano                     | Hugo Richard          | Criteo                                 |
| Mathieu Molina     | INRIA                                      | Ziyad Benomar         | ENSAE                                  |
| Helène Halconruy   | Telecom SudParis                           | Christian Yeo         | Université Paris Cité<br>ENGIE         |
| Rudy Morel         | Simons Foundation                          |                       |  |
|                    |  |                       |  |

# **MISCELANEOUS**