

Markov Chain Model for Microcredit Leading to Inclusion

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1. Introduction

Microcredit is a low amount credit bearing interests granted to micro-entrepreneurs who do not have access to regular bank services.

This type of credit makes it possible for people who are excluded from the banking system as we know it to create or develop an income-generating activity. It can be granted to individuals as well as groups.

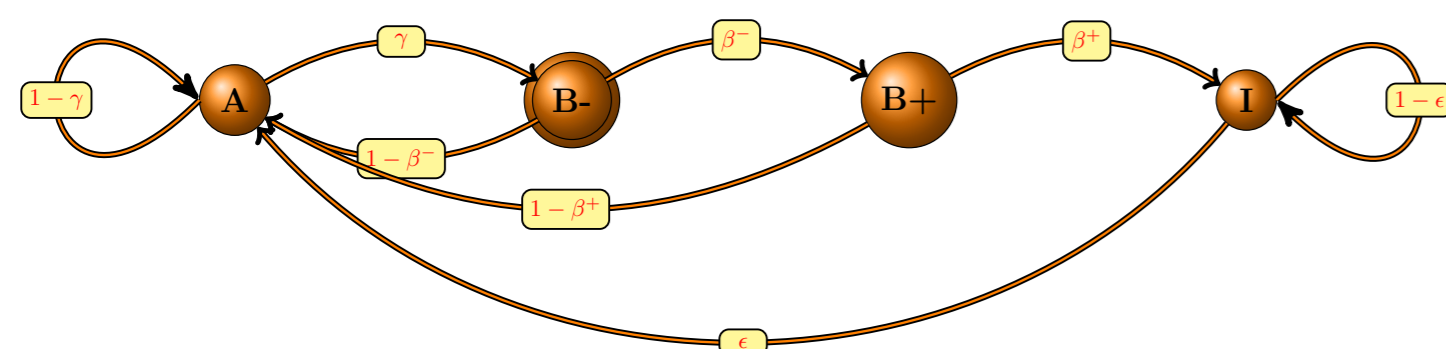
Previous mathematical models of microcredit: (Tedeschi[2006]; Khodr, M. Diener, F. Diener et Protter[2009]; Dhib, M. Diener et F. Diener[2013])

The purpose of the research: find a new mathematics models for analyze the other important characteristic of microcredit, namely the mechanism that allows a beneficiary with some successive microcredit can access a credit from regular bank.

2. Markov Chain Model

In the model, we introduce a **Markov chain** $(X_t)_{t \geq 0}$, which consist of four states:

- A (applicant)
- B^- (beneficiary with a loan k^- , an interest rate r)
- B^+ (beneficiary with a loan k^+ , an interest rate r ; $k^+ > k^-$)
- I (inclu with a loan k^+ , an interest rate r' , $r' < r$)



The transition matrix:

$$P = \begin{pmatrix} 1-\gamma & \gamma & 0 & 0 \\ 1-\beta^- & 0 & \beta^- & 0 \\ 1-\beta^+ & 0 & 0 & \beta^+ \\ \epsilon & 0 & 0 & 1-\epsilon \end{pmatrix}$$

Example of a trajectory:

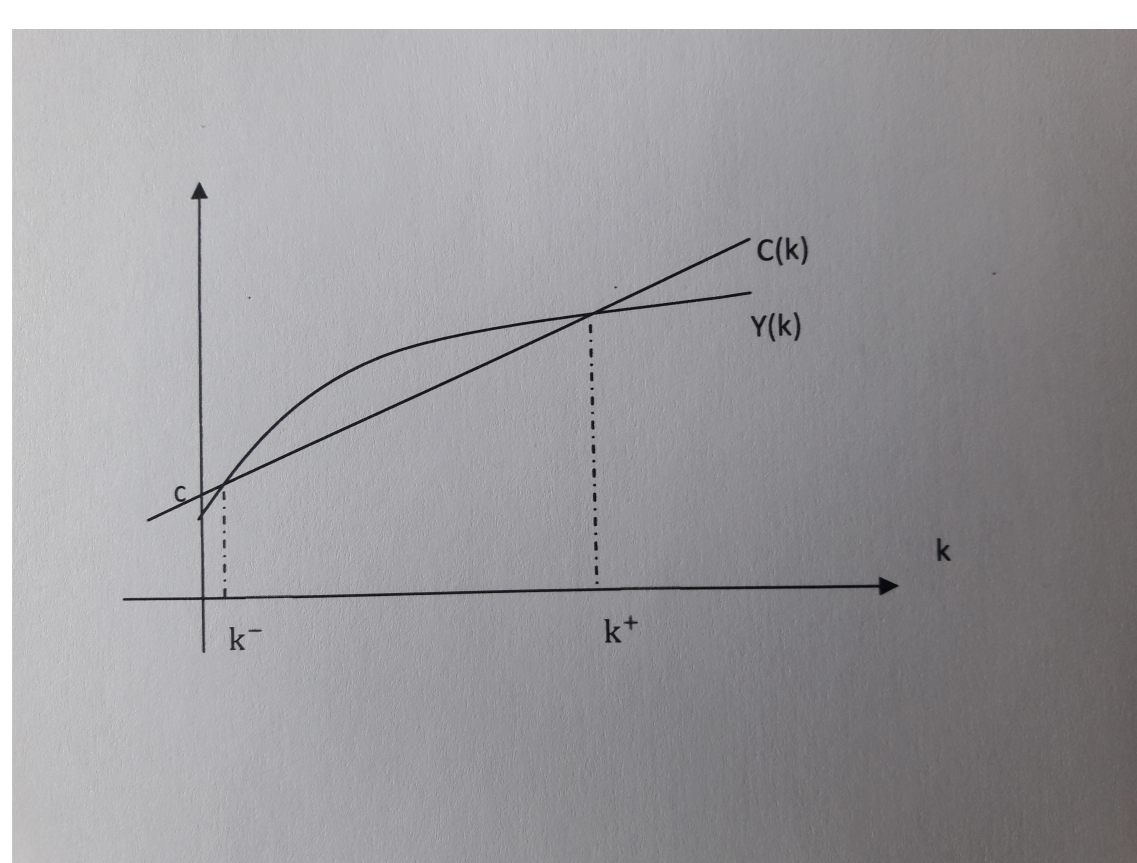
- $AB^-B^+IIIIIIII\dots$
- $AAB^-AB^-B^+IIA\dots$

3. Net Revenue

Net Revenue is the production function minus the cost function

$Y(k)$ is the production function.

$C(k) = c + (1+r)k$ is the cost function.



$$Y(k) = k^\alpha$$

$$C(k) = c + (1+r)k$$

$$(Y - C)(k^-) = (Y - C)(k^+) = 0$$

4. The Expected Total Profit

• **The profit of one period**

$$f(X_{t-1}, X_t) = \begin{cases} (r - r')k^+ & \text{if } (I, I) \\ 0 & \text{if not} \end{cases}$$

• **The total discounted profit of a trajectory** $(X_0, X_1, \dots, X_t, \dots)$ for $X_0 = x$

$$W(x) = \sum_{t \geq 1} \delta^t f(X_{t-1}, X_t)$$

δ is discount factor for a time of a loan.

• **Proposition (Dhib/Diener)**

$$\mathbb{E}(W(x)) = \delta(I - \delta P)^{-1} Z(x)$$

where $Z(x) = \mathbb{E}(f(X_0, X_1) | X_0 = x)$.

5. Resultats

• **Proposition (application of the Perron-Frobenius theorem)**

Let $(X_t)_{t \geq 0}$ be the above Markov chain with the state space $S = \{A, B^-, B^+, I\}$ and transition matrix P . The Markov chain has a unique equilibrium state π^* ,

$$\pi^* = \frac{1}{\epsilon + \epsilon\gamma + \epsilon\gamma\beta^- + \gamma\beta^-\beta^+} (\epsilon, \epsilon\gamma, \epsilon\gamma\beta^-, \gamma\beta^-\beta^+).$$

The proportions of four states tends to the equilibrium distribution π^* , when t tends $+\infty$.

• **Parameter estimation**

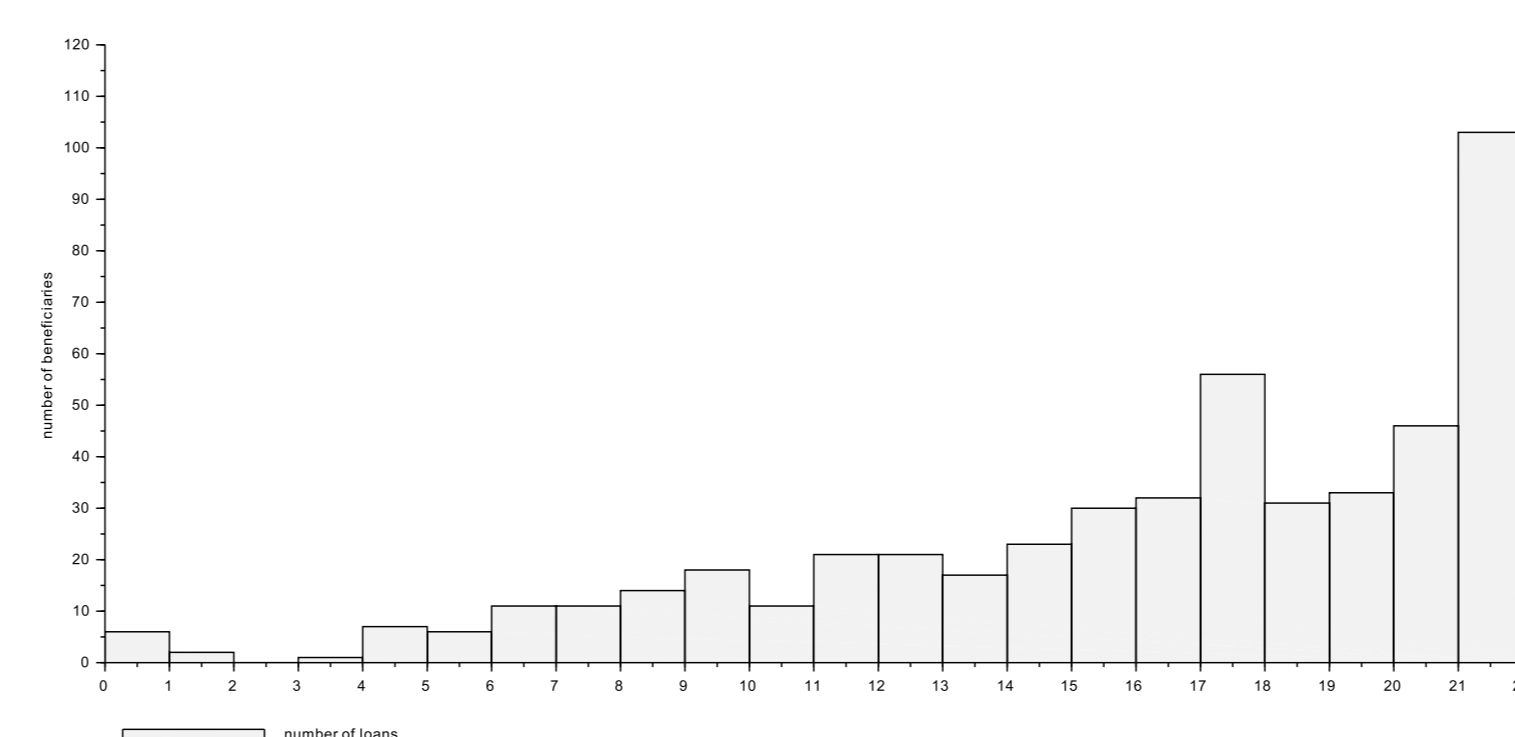
If the MFI has type data $(X_t)_{t=0, \dots, +\infty}$ then the Ergodic theorem would allow it to calculate π^* and then γ , β^- and β^+ :

$$\gamma = \frac{\pi_{B^-}^*}{\pi_A^*}; \beta^- = \frac{\pi_{B^+}^*}{\pi_{B^-}^*}; \beta^+ = \frac{\pi_I^*}{\pi_{B^+}^*}.$$

• **Simulation of the distribution of total profit**

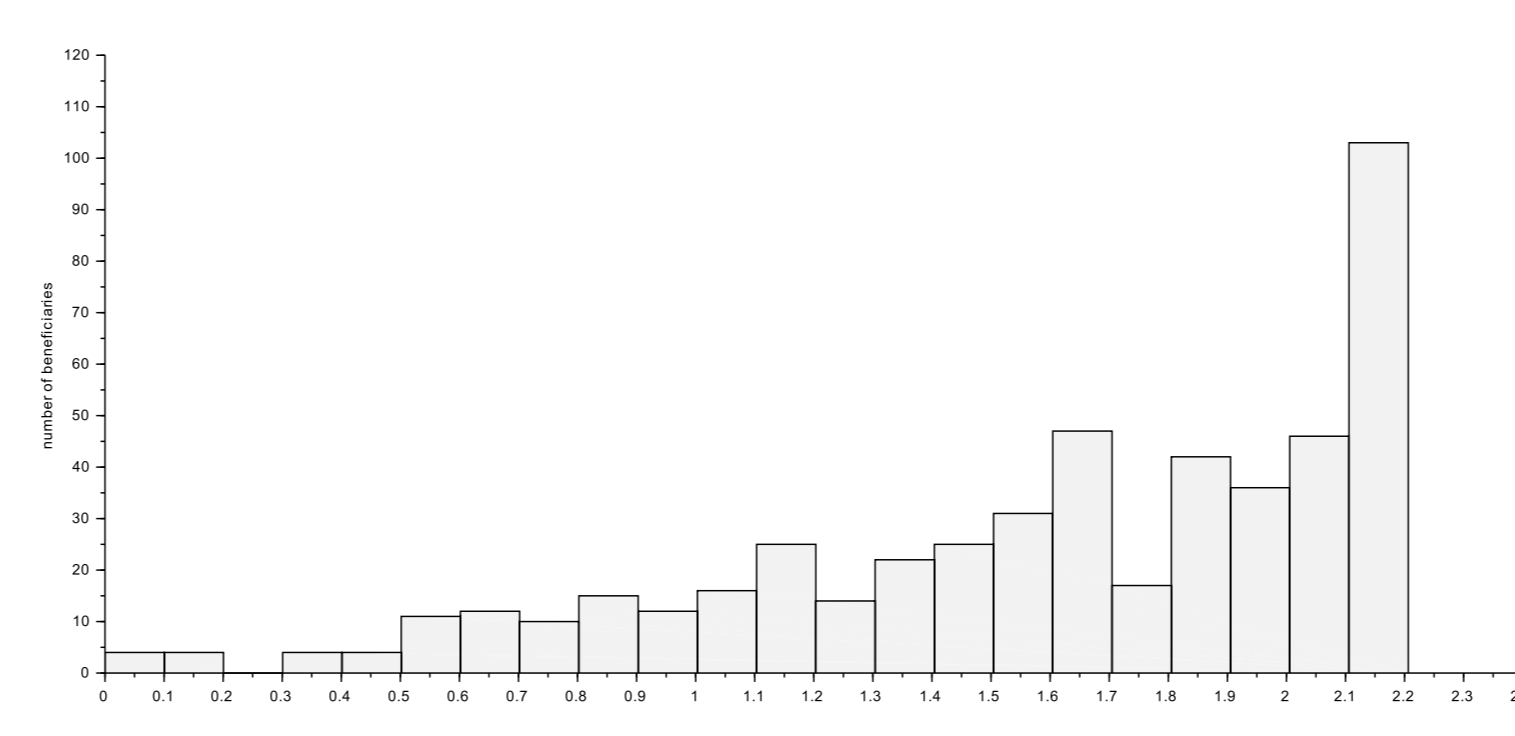
– **Number of loans (I, I)**

Number of applicants/beneficiaries=500; Trajectory length=25;
 $\gamma=0.5$, $\beta^- = 0.9$, $\beta^+ = 0.7$, $\epsilon=0.02$.



– **Total discounted profit**

Number of applicants/beneficiaries=500; Trajectory length=25;
 $\gamma=0.5$, $\beta^- = 0.9$, $\beta^+ = 0.7$, $\epsilon=0.02$, $r=0.2$, $r'=0.04$.



• **Absence of strategic default**

To avoid a strategic default, the MFI has a make sur the parameters have been fixed so that:

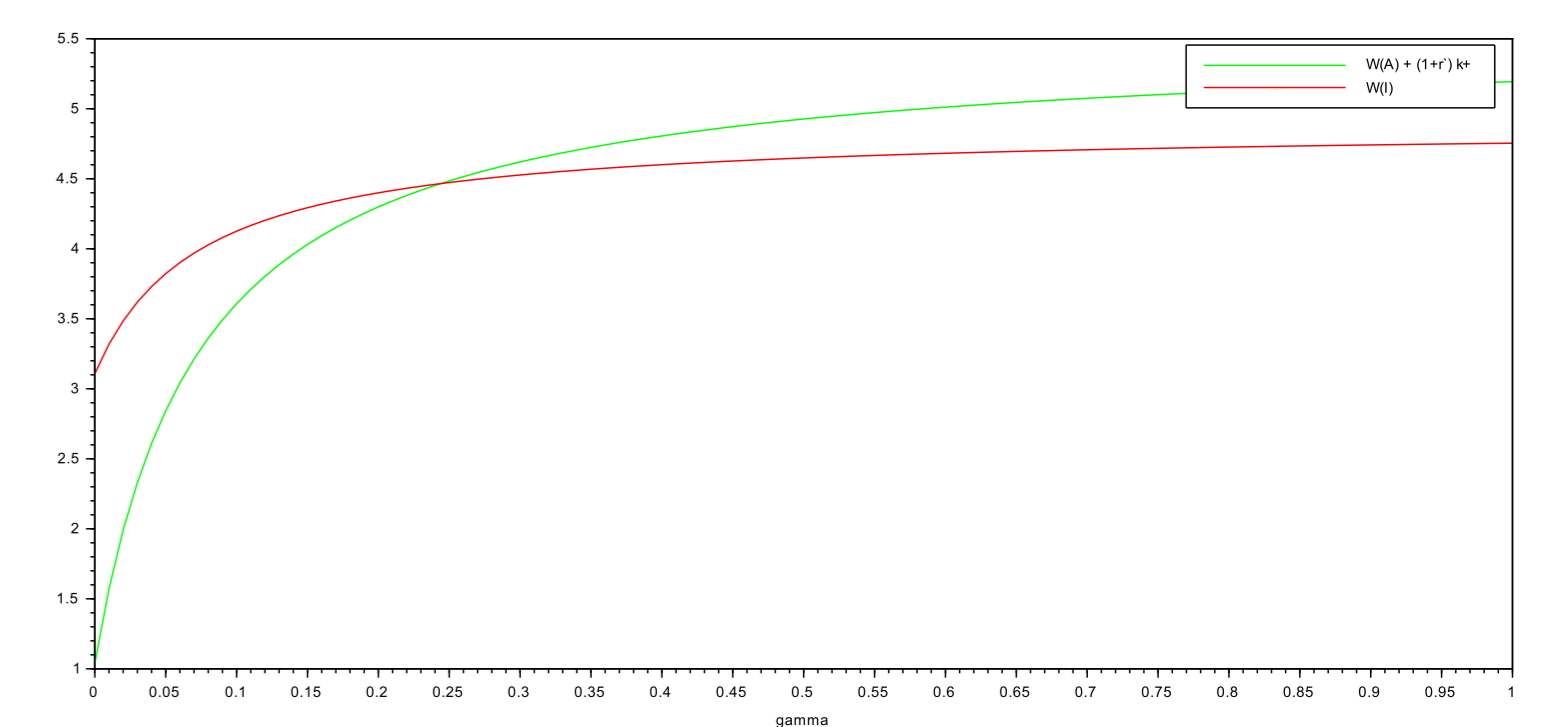
$$W_t(I) \geq W_t(A) + (1+r')k^+$$

• **Application of the proposition (Dhib/Diener)**

We apply the proposition (Dhib/Diener) to search the values γ and ϵ at the condition of absence of strategic default.

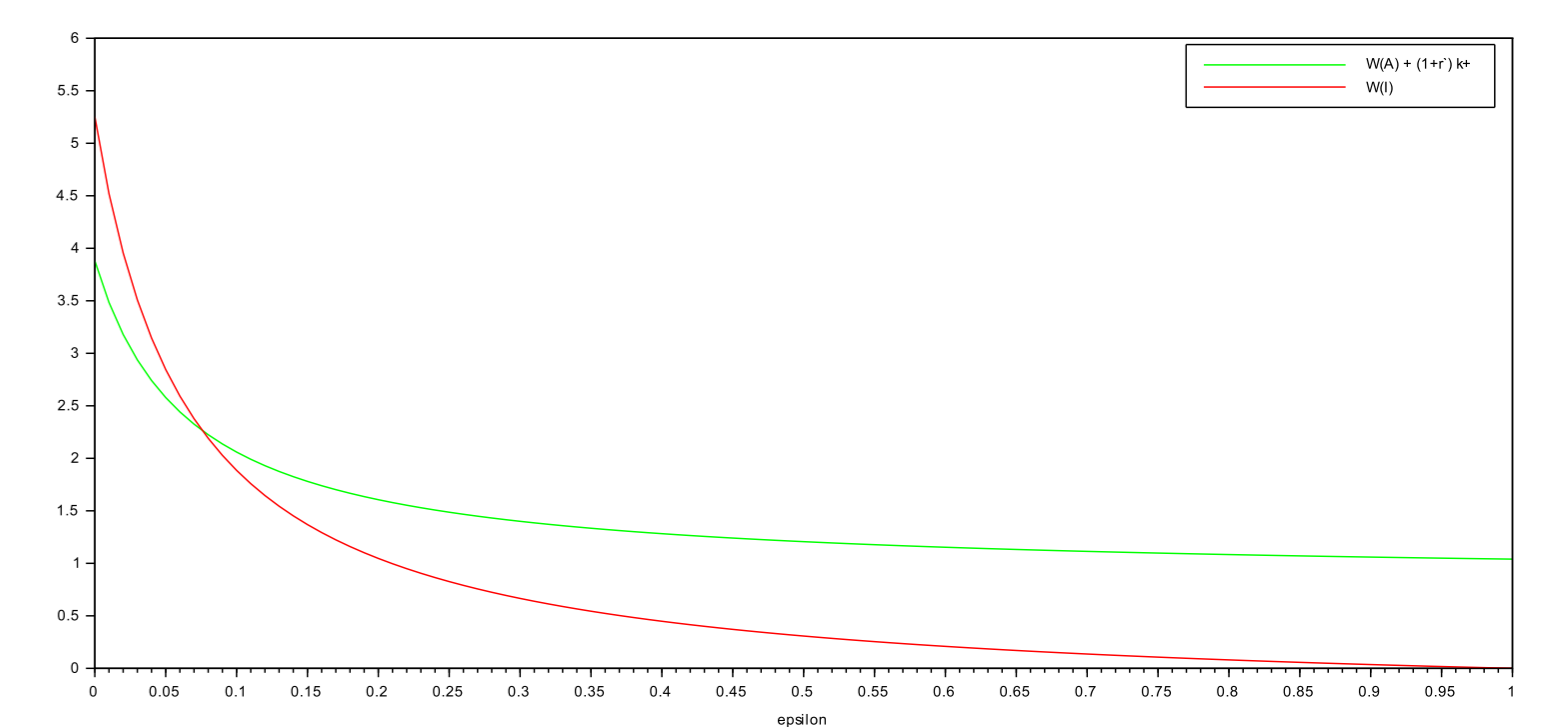
– Case 1:

$$\beta^- = 0.9, \beta^+ = 0.7, \epsilon = 0.02, r = 0.2, r' = 0.04$$



– Case 2:

$$\gamma = 0.1, \beta^- = 0.9, \beta^+ = 0.7, r = 0.2, r' = 0.04$$



References

- [1] F. Diener, M. Diener, and N. Dhib. Valuer espérée d'un microcrédit dans un modèle de chaine de markov. Technical report, Laboratoire Jean-Alexandre Dieudonné, <http://math.unice.fr/diener/Mifi/ValEspeMFNahla.pdf>, 2013.
- [2] F. Diener, M. Diener, O. Khodr, P. Protter. Mathematical Models for Microlending. *Proceedings of the 16th Mathematical Conference of Bangladesh Mathematical Society, Dhaka, Bangladesh*, 2009.
- [3] G. A. Tedeschi. Here today, gone tomorrow: can dynamic incentives make microfinance more flexible? *Journal of Development Economics*, 80:84-105, 2006.
- [4] Nahla Dhib. *Les effets du microcrédit sur le développement économique en Tunisie : d'une étude statistique vers une modélisation mathématique*. Thèse d'économie soutenue à l'Université de Sfax le 19 décembre 2017.
- [5] O. Khodr. *Modèles dynamiques des innovations du microcrédit*, EDSFA, Laboratoire Dieudonné, Université Nice Sophia-Antipolis, Thèse de doctorat, 2011.
- [6] Sheldon M. Ross. *Stochastic Process*, John Wiley & Sons, Inc, New York, 1996.
- [7] Sébastien Loustau. *Chaîne de Markov et processus markoviens de sauts, Applications aux files d'attente*, Ecole Centrale de Marseille, 2008.

Poster Presentations

WU Vienna, Mon, September 9, 2019, 10:40 (first coffee break)
to Tue, September 10, 2019, 11:10 (morning coffee break)
LC Forum, LC - Learning Center, ground floor (LC.0.000)

Tereza Cristina **Amorelli** (Banco do Brasil)
Pricing non-traded assets using indifference pricing

Alejandro **Balbás** (University Carlos III of Madrid/Spain)
Golden strategies in derivative markets

Erwinna **Chendra** (Parahyangan Catholic University)
Pricing employee stock options with a binomial method: case study in indonesia

Ewa **Dziwok** (University of Economics in Katowice)
Fund Transfer Pricing mechanism – different approaches to the reference yield's construction

Alireza **Fallahi** (Amirkabir University of Technology)
Sufficient nonlinear forecasting using factor models

Pavel V. **Gapeev** (London School of Economics)
On the Fourier-Laplace transforms of first exit times for one-dimensional diffusions and their applications to models of stochastic volatility

Laura **Garcia-Jorcano** (Universidad de Castilla-La Mancha)
Traffic light system for systemic stress: TALIS-cube

Ivana **Geček Tuđen** (University of Zagreb)
Ruin probability for discrete risk processes

Darjus **Hosszejni** (WU Vienna)
Approaches toward the Bayesian estimation of the stochastic volatility Model with leverage

Verena **Köck** (WU Wien)
Option hedging in models with jumps

Borys **Koval** (Vienna University of Economics and Business)
Estimating a time-varying parameter model with shrinkage for the Standard&Poor's 500 index.

Djaffar **Lessy** (Université Cote d'Azur)
Markov chain model for microcredit leading to inclusion

Paul Felix **Reiter** (TU Dresden)
Feature engineering in univariate time series forecasting

Anne **Sumpf** (Technische Universität Dresden)
Credit Risk with Credibility Theory: a distribution-free estimator for probability of default, value-at-risk and expected shortfall

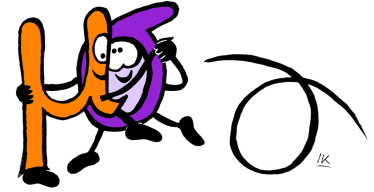
VCMF 2019

Vienna Congress on Mathematical Finance

Mon–Wed, Sept. 9-11, 2019

VCMF Educational Workshop

Thu–Fri, Sept. 12-13, 2019



Confirmation of Presentation

Vienna, September 16, 2016

To Whom it May Concern:

We herewith confirm that

Djaffar LESSY
(Université Cote d'Azur, France)

presented the following poster

“Markov chain model for microcredit leading to inclusion”

at the

Vienna Congress on Mathematical Finance
Mon–Wed, Sept. 9-11, 2019.

With best regards,

Sandra Trenovatz
VCMF Conference & Workshop Secretary