

Markov additive friendships

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Theory of friends for Lévy processes

Wiener–Hopf factorisation of Lévy processes

- let ξ be a Lévy process with characteristic exponent ψ , i.e., $\mathbb{E}[e^{i\theta\xi_t}] = e^{t\psi(\theta)}$
- the **ascending ladder height process** H^+ is a subordinator tracking the new suprema of ξ ,
- the **descending ladder height process** H^- plays the same role for the infima
- for ψ^\pm denoting the characteristic exponents of H^\pm , it holds

$$\psi(\theta) = -\psi^-(-\theta)\psi^+(\theta)$$

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Problem

Given a LK exponent ψ the Wiener–Hopf factors can very rarely be explicitly determined.

The inverse problem

- start with two subordinators H^\pm having LK exponents ψ^\pm
- when is there a Lévy process ξ , with LK exponent ψ such that $\psi = -\psi^-(-\cdot)\psi^+$?
- when such ξ exists, we call H^\pm **friends** and ξ the **bonding process**

The Theorem of friends

- d^\pm drift of H^\pm
- Π^\pm Lévy measure of H^\pm
- H^\pm are **compatible** if $d^\mp > 0$ implies that Π^\pm has a càdlàg density $\partial\Pi^\pm$ that can be expressed as the tail of a signed measure

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Theorem (Vigon, 2002)

H^\pm are friends **if, and only if**, they are compatible and the function

$$\Upsilon(x) = \begin{cases} \int_{(0,\infty)} (\Pi^-(y, \infty) - \psi^-(0)) \Pi^+(x + dy) + d^- \partial\Pi^+(x), & x > 0, \\ \int_{(0,\infty)} (\Pi^+(y, \infty) - \psi^+(0)) \Pi^-(-x + dy) + d^+ \partial\Pi^-(-x), & x < 0, \end{cases}$$

is a.e. increasing on $(0, \infty)$ and a.e. decreasing on $(-\infty, 0)$.

Then, Υ is a.e. the right/left tail of the Lévy measure of the bonding process.

- a subordinator H^+ is called **philanthropist** if its Lévy measure admits a decreasing density
 - **equivalently**, philanthropists are subordinators that are friends with pure drift subordinators $H_t^- = d^- t$
- ↔ spectrally negative Lévy processes that do not drift to $-\infty$ can be factorised into a philanthropist and a pure drift

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Theorem (Vigon, 2002)

Any two philanthropists are friends.

Markov additive friendships

- a nice Markov process (ξ, J) is a MAP on $\mathbb{R} \times \{1, \dots, n\}$ if

$$\mathbb{E}^{0,i} [f(\xi_{t+s} - \xi_t, J_{t+s}) \mid \mathcal{F}_t] \mathbf{1}_{\{t < \zeta\}} = \mathbb{E}^{0,J_t} [f(\xi_s, J_s)] \mathbf{1}_{\{t < \zeta\}}$$

- **equivalently**, a MAP can be characterised as a **regime-switching Lévy process**
 - $\xi^{(i)}$ is a Lévy process for any phase $i \in [n]$
 - J is a Markov chain with transition matrix Q
 - when J is in state i , run an independent copy of $\xi^{(i)}$
 - phase switches from i to j trigger an additional jump with distribution F_{ij}

Analytic characterisation of MAPs

- ψ_j LK exponent of $\xi^{(i)}$
- Π_i Lévy measure of $\xi^{(i)}$ and denote $\Pi_{i,j} := q_{i,j}F_{i,j}$
- call $\mathbf{\Pi} = (\Pi_{i,j})_{i,j \in [n]}$ Lévy measure matrix of ξ
- we have $\mathbb{E}^{0,i}[e^{i\theta\xi_t}\mathbf{1}_{\{J_t=j\}}] = (\exp(t\mathbf{\Psi}(\theta)))_{i,j}$ with **characteristic matrix exponent**

$$\begin{aligned}\mathbf{\Psi}(\theta) &= \text{diag}((\psi_i(\theta))_{i \in [n]}) + \mathbf{Q} \odot (\widehat{F}_{i,j}(\theta))_{i,j \in [n]} \\ &= \begin{bmatrix} \psi_1(\theta) + q_{1,1} & \widehat{\Pi}_{1,2}(\theta) & \cdots & \widehat{\Pi}_{1,n}(\theta) \\ \widehat{\Pi}_{2,1}(\theta) & \psi_2(\theta) + q_{2,2} & \cdots & \widehat{\Pi}_{2,n}(\theta) \\ \vdots & \vdots & \ddots & \vdots \\ \widehat{\Pi}_{n,1}(\theta) & \widehat{\Pi}_{n,2}(\theta) & \cdots & \psi_n(\theta) + q_{n,n} \end{bmatrix}\end{aligned}$$

MAP Wiener–Hopf factorisation

- ascending/descending ladder height MAPs (H^\pm, J^\pm): ordinator H^\pm tracks new suprema/infima of ξ and J^\pm tracks phases during which they occur
- they are MAP subordinators (increasing ordinators) with matrix exponents Ψ^\pm
- we always assume that J is irreducible and hence has an invariant distribution represented by a vector π

Theorem [DDK17, I17, DTW23+]

$$\Psi(\theta) = -\Delta_\pi^{-1} \Psi^-(-\theta) \Delta_\pi \Psi^+(\theta),$$

where Δ_π is the diagonal matrix containing π .

The inverse problem

- we call a MAP subordinator (H^+, J^+) a π -friend of (H^-, J^-) if
 1. $\Psi := -\Delta_\pi^{-1} \Psi^-(-\cdot) \Delta_\pi \Psi^+$ is a characteristic MAP exponent
 2. $\pi^\top \Psi(0) \leq \mathbf{0}^\top$
- then, a MAP (ξ, J) with matrix exponent Ψ is called **bonding MAP**
- the second condition ensures that
 - π is a valid candidate for an invariant distribution of J
 - (H^+, J^+) is a π -friend of (H^-, J^-) iff (H^-, J^-) is a π -friend of (H^+, J^+) \rightsquigarrow **symmetric relation** and the bonding MAP between (H^-, J^-) and (H^+, J^+) is the **dual MAP** of (ξ, J)

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Questions

1. Are there necessary and sufficient conditions for π -friendship generalising Vigon's characterisation of Lévy friendships?
2. Is there a concept of **MAP philanthropy**?

(H^+, J^+) and (H^-, J^-) are called π -compatible if

1. if $d_i^{\mp} > 0$, then $\Pi_{i,j}^{\pm}$ restricted to $(0, \infty)$ has a càdlàg density $\partial\Pi_{i,j}^{\pm}$ and $\partial\Pi_{i,i}^{\pm}$ can be expressed as the tail of a signed measure

2. **balance conditions** on the characteristics that in particular require

- $q_{i,j}^+ d_i^- F_{i,j}^+(\{0\}) = \frac{\pi(j)}{\pi(i)} q_{j,i}^- d_i^+ F_{j,i}^-(\{0\})$
- the function

$$x \mapsto q_{i,j}^+ \left(\int_0^{\infty} \mathbf{1}_{\{y>x\}} \bar{\Pi}_i^-(y-x) F_{i,j}^+(dy) + d_i^- f_{i,j}^+(x) \right) - \frac{\pi(j)}{\pi(i)} q_{j,i}^- \left(\int_0^{\infty} \mathbf{1}_{\{-x<y\}} \bar{\Pi}_j^+(x+y) F_{j,i}^-(dy) + d_j^+ f_{j,i}^-(-x) \right)$$

is a.e. equal to a right-continuous, bounded variation function converging to 0 at $\pm\infty$

3. the vectors $-\Delta_{\pi}^{-1} \Psi^-(0)^\top \Delta_{\pi} \Psi^+(0) \mathbf{1}$ and $-\pi^\top \Delta_{\pi}^{-1} \Psi^-(0)^\top \Delta_{\pi} \Psi^+(0)$ are nonnegative

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π -compatibility is **necessary** for π -friendship \rightsquigarrow There are **no** MAP philanthropists!

Theorem (Döring, T. and Watson, 2023+)

(H^+, J^+) and (H^-, J^-) are π -friends **if, and only if**, they are π -compatible and the matrix-valued function

$$\Upsilon(x) = \begin{cases} \left(\int_{x^+}^{\infty} \Delta_{\pi}^{-1} \left(\bar{\Pi}^-(y-x) - \Psi^-(0) \right)^{\top} \Delta_{\pi} \Pi^+(dy) + \Delta_{\mathbf{d}}^{-} \partial \Pi^+(x) \right), & x > 0, \\ \left(\int_{(-x)^+}^{\infty} \Delta_{\pi}^{-1} \left(\Pi^-(dy) \right)^{\top} \Delta_{\pi} \left(\bar{\Pi}^+(y+x) - \Psi^+(0) \right) + \Delta_{\pi}^{-1} \left(\Delta_{\mathbf{d}}^{+} \partial \Pi^-(-x) \right)^{\top} \Delta_{\pi} \right), & x < 0, \end{cases}$$

is a.e. equal to a function decreasing on $(0, \infty)$ and increasing on $(-\infty, 0)$.

Then, Υ is a.e. the right/left tail of the Lévy measure matrix of the bonding MAP.

We call (H^+, J^+) and (H^-, J^-) **π -fellows** if they have decreasing Lévy density matrices $\partial\Pi^+$ and $\partial\Pi^-$ on $(0, \infty)$, and the matrix functions

$$-\Delta_{\pi}^{-1}\Psi^{-}(0)^{\top}\Delta_{\pi}\bar{\Pi}^{+}(x) + \Delta_{d}^{-}\partial\Pi^{+}(x), \quad x > 0,$$

and

$$-\Delta_{\pi}^{-1}\Psi^{+}(0)^{\top}\Delta_{\pi}\bar{\Pi}^{-}(x) + \Delta_{d}^{+}\partial\Pi^{-}(x), \quad x > 0,$$

are decreasing.

Note: Any two Lévy fellows are Lévy philanthropists and therefore friends.

Properties of fellowship

Recall: H^+ Lévy philanthropist $\iff H^+$ has a decreasing Lévy density $\iff H^+$ is friends with any pure drift

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Lemma (Döring, T. and Watson, 2023+)

A MAP subordinator (H^+, J^+) with decreasing Lévy density matrix is a π -friend of a pure drift MAP (H^-, J^-) (that is, $H_t^- = \int_0^t d_{J_s^-}^- ds$) if, and only if, they are π -compatible π -fellows.

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Theorem (Döring, T. and Watson, 2023+)

Any two π -compatible π -fellows are π -friends.

- only known MAP WH-factorisation is from the **deep factorisation of the stable process**
- to generate explicit friendships it is crucial to find manageable criteria for π -compatibility
- we develop such criteria in two cases
 1. at least one of the putative friends is a pure drift
 2. both candidates have zero drift parts and no transitional atoms (i.e., $q_{i,j}^{\pm} F_{i,j}^{\pm}(\{0\}) = 0$)
- the first case allows us to give a general construction principle for spectrally one-sided MAPs and modulated Brownian motions starting from the WH-factors
- combining the compatibility criteria from both cases, we construct MAPs jumping in both directions (**Markov modulated double exponential jump diffusions**)

Probabilistic interpretation of friendships

- the matrix Wiener–Hopf factorisation tells us that any irreducible MAP is a bonding process and that the corresponding friends can be chosen as the ascending/descending ladder height processes

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- put differently: given a friendship, are the friends (a version) of the ascending/descending ladder height processes of the bonding MAP?

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- the matrix Wiener–Hopf factorisation tells us that **any irreducible MAP is a bonding process** and that the corresponding friends **can be chosen** as the ascending/descending ladder height processes
 - is this the only possible choice?
 - put differently: given a friendship, are the friends (a version) of the ascending/descending ladder height processes of the bonding MAP?
- ↪ verify that Wiener–Hopf factorisation is **unique** in the sense that for MAP subordinator exponents Ψ^\pm and Φ^\pm such that

$$\Psi = -\Delta_\pi^{-1} \Psi^- (-\cdot)^\top \Delta_\pi \Psi^+ = -\Delta_\pi^{-1} \Phi^- (-\cdot)^\top \Delta_\pi \Phi^+,$$

it holds

$$\Phi^+ = \Delta \Psi^+, \quad \Phi^- = \Delta^{-1} \Psi^-,$$

for some diagonal matrix Δ

Uniqueness of the Wiener–Hopf factorisation

- \mathcal{A}_0 is the class of matrix exponents of **irreducible and finite mean** MAP subordinators
- \mathcal{A}_1 is the class of MAP subordinator exponents such that for any i one of the following is true
 1. $\lim_{\theta \rightarrow \pm\infty} |\psi_i(\theta)| = \infty$
 2. ψ_i is compound Poisson and for any j , $\Pi_{ij} \ll \text{Leb}$

Theorem (Döring, T. and Watson, 2023+)

Let (H^\pm, J^\pm) be irreducible π -friends s.t. one of the following sets of conditions holds:

1.
 - the bonding MAP is irreducible and killed,
 - the ladder height processes of the bonding MAP are irreducible, and π is invariant for the bonding MAP;
2.
 - the bonding MAP is irreducible and unkilld,
 - $\Psi^\pm \in \mathcal{A}_0 \cap \mathcal{A}_1$, and the exponents of the ladder height processes of the bonding MAP belong to $\mathcal{A}_0 \cap \mathcal{A}_1$.

Then (H^\pm, J^\pm) are versions of the ladder height processes of their bonding MAP.

- we extend Vigon's theory of Lévy friendships to Markov additive processes
- we demonstrate that there is no direct correspondence of philanthropy in the MAP world
- we coin a different notion, fellowship, that allows us to generate the first explicit MAP WH-factorisations since Kyprianou's deep factorisation of the stable process
- we provide a probabilistic interpretation of friendships by studying uniqueness of the MAP WH-factorisation

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Thank you for your attention!