

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_s \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

BSS Processes and Intermittency/Volatility

Turbulence Stochastics

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Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Amibit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_t \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

- ▶ BSS models
- ▶ Turbulence background
- ▶ BSS models (cont.)
- ▶ Inference on intermittency/volatility
- ▶ Further ongoing work
- ▶ Some open questions

Brownian semistationary (*BSS*) processes:

$$Y_t = \int_{-\infty}^t g(t-s)\sigma_s dB_s + \int_{-\infty}^t q(t-s)a_s ds \quad (1)$$

where B is Brownian motion, g and q are square integrable functions on \mathbb{R} , with $g(t) = q(t) = 0$ for $t < 0$, and σ and a are cadlag processes.

When σ and a are stationary, as will be assumed throughout this talk, then so is Y .

It is sometimes convenient to indicate the formula for Y as

$$Y = g * \sigma \bullet B + q * a \bullet Leb. \quad (2)$$

Outline

BSS models

Definition

Key object of interest
Realised Quadratic
Variation

Turbulence
background

Ambit processes
Intermittency

BSS models
(cont.)

Canon
Semi- and
non-semimartingale
questions

Inference on inter-
mittency/volatility

Introduction
Increment process
Examples
RQV and IV
Conditions ensuring
 $\pi_s \rightarrow \delta_0$
Consistency
Feasible version

Further ongoing
work

Relaxing assumptions
Realised Variation
Ratio

Outline

BSS models

Definition

Key object of interest
Realised Quadratic
Variation

Turbulence background

Ambit processes
Intermittency

BSS models (cont.)

Canon
Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction
Increment process
Examples
RQV and IV
Conditions ensuring
 $\pi_t \rightarrow \delta_0$
Consistency
Feasible version

Further ongoing work

Relaxing assumptions
Realised Variation
Ratio

We consider the *BSS* processes to be the natural analogue, in stationarity related settings, of the class *BSM* of Brownian semimartingales.

- ▶ The *BSS* processes are not in general semimartingales

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes
Intermittency

BSS models (cont.)

Canon
Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction
Increment process
Examples
RQV and IV
Conditions ensuring
 $\pi_s \rightarrow \delta_0$
Consistency
Feasible version

Further ongoing work

Relaxing assumptions
Realised Variation
Ratio

The key object of interest is the *integrated variance* (IV)

$$\sigma_t^{2+} = \int_0^t \sigma_s^2 ds$$

We shall discuss to what extent *realised quadratic variation* of Y can be used to estimate σ_t^{2+} .

- ▶ Note that the relevant question here is whether a suitably normalised version of the realised quadratic variation, and not necessarily the realised quadratic variation itself, converges in probability/law.

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_\delta \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

In semimartingale theory the quadratic variation $[Y]$ of Y is defined in terms of the Ito integral $Y \bullet Y$, as $[Y] = Y^2 - 2Y \bullet Y$. In that setting $[Y]$ equals the limit in probability as $\delta \rightarrow 0$ of the *realised quadratic variation* $[Y_\delta]$ of Y defined by

$$[Y_\delta]_t = \sum_{j=1}^{\lfloor t/\delta \rfloor} \left(Y_{j\delta} - Y_{(j-1)\delta} \right)^2 \quad (3)$$

where $\lfloor t/\delta \rfloor$ is the largest integer smaller than or equal to t/δ . It is this latter definition of quadratic variation that we will use here.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

White noise case:

$$Y_t(x) = \mu + \int_{A_t(x)} g(t-s, |\zeta-x|) \sigma_s(\zeta) W(d\zeta, ds) \\ + \int_{D_t(x)} q(t-s, |\zeta-x|) a_s(\zeta) d\zeta ds.$$

Here $A_t(\sigma)$ and $D_t(\sigma)$ are termed *ambit sets*.

Lévy case:

$$\sigma_t^2(x) = \int_{C_t(x)} h(t-s, |\zeta-x|) L(d\zeta, ds)$$

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes**
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_s \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

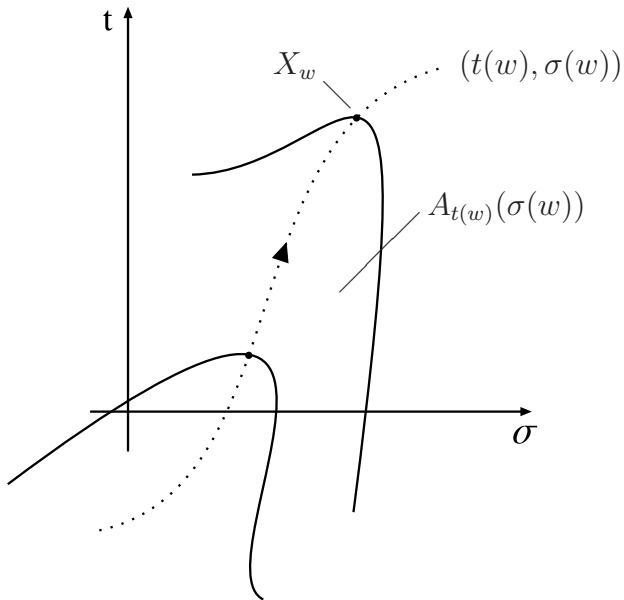


Figure: Ambit processes

Outline

BSS models

Definition

Key object of interest

Realised Quadratic

Variation

Turbulence background

Amibit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_t \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

In turbulence the basic notion of *intermittency* refers to the fact that the energy in a turbulent field is unevenly distributed in space and time.

The present presentation is part of a project that aims to construct a stochastic process model of the field of velocity vectors representing the fluid motion, conceiving of the intermittency as a positive random field with random values $\sigma_t(x)$ at positions (x, t) in space-time.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

However, most extensive data sets on turbulent velocities only provide the time series of the main component (i.e. the component in the main direction of the fluid flow) of the velocity vector at a single location in space.

In the present talk the focus is on this latter case, but in the concluding Section some discussion will be given on the further intriguing issues that arise when addressing tempo-spatial settings.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic

Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and non-semimartingale questions

Inference on intermittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

For simplicity we now assume that $\sigma \perp\!\!\!\perp B$ and that $q = 0$, i.e. there is no drift term in Y and

$$Y_t = \int_0^t g(t-s) \sigma_s dB_s.$$

However, at the end of the talk some discussion will be given on more general settings.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Let $Z = \{Z_t\}_{t \in \mathbb{R}}$ denote a second order stationary stochastic process, possibly complex valued, of mean 0 and continuous in quadratic mean. Recall that Z is said to be a *moving average process* if it is of the form

$$Z_t = \int_{-\infty}^{\infty} \phi^*(t-s) d\Xi_s^* \quad (4)$$

where ϕ^* is an, in general complex, deterministic and square integrable function and where the process Ξ^* has orthogonal increments with $\mathbb{E} \left\{ |d\Xi_t^*|^2 \right\} = \omega^* dt$ for some constant $\omega^* > 0$; finally, the integral in (4) is defined in the quadratic mean sense.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

A second order stationary process (of mean 0 and continuous in quadratic mean) is called *regular* (or linearly regular) provided its future values cannot be predicted by linear operations on past values without error. Such processes can be written in the continuous time Wold decomposition form

$$Z_t = \int_{-\infty}^t \phi(t-s) d\Xi_s + V_t \quad (5)$$

where ϕ is an, in general complex, deterministic square integrable function satisfying $\phi(s) = 0$ for $s < 0$ and where the process Ξ has orthogonal increments with $E \left\{ |d\Xi_t|^2 \right\} = \omega dt$ for some constant $\omega > 0$. Finally, the process V is *nonregular* (i.e. predictable by linear operations on past values without error).

Outline

BSS models

Definition
Key object of interest
Realised Quadratic
Variation

Turbulence background

Ambit processes
Intermittency

BSS models (cont.)

Canon
Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction
Increment process
Examples
RQV and IV
Conditions ensuring
 $\pi_s \rightarrow \delta_0$
Consistency
Feasible version

Further ongoing work

Relaxing assumptions
Realised Variation
Ratio

Given Z and neglecting sets of measure 0, both ϕ and Ξ are uniquely determined, ϕ up to a factor of modulus 1 and the driving process Ξ in the L^2 sense and up to an additive constant.

- ▶ A slightly stronger condition than regularity is the requirement that Z be *completely nondeterministic*, meaning that $\bigcap_{t \in \mathbb{R}} \overline{\text{sp}} \{Z_s : s \leq t\} = \{0\}$ In this case

$$Z = \phi * \Xi$$

with ϕ real and uniquely determined up to a real constant of proportionality; and the same is therefore true of Ξ .

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_s \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

We begin by recalling a classical necessary and sufficient condition, due to [Kni92], for the semimartingale property of a process X of the form

$$X_t = \int_{-\infty}^t g(t-s) dB_s. \quad (6)$$

Knight's Theorem says that $(X_t)_{t \geq 0}$ is a semimartingale in the $(\mathcal{F}_t^{B, \infty})_{t \geq 0}$ filtration if and only if

$$g(t) = c + \int_0^t b(s) ds \quad (7)$$

for some $c \in \mathbb{R}$ and a square integrable function b .

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Example An example of some particular interest is where

$$g(t) = t^\alpha e^{-\lambda t} \quad \text{for } t \in (0, \infty)$$

and some $\lambda > 0$. In order for the integral $g * \sigma \bullet B$ to exist α is required to be greater than $-\frac{1}{2}$, and for g to be of the form (7) we must have $\alpha > \frac{1}{2}$. In other words, the nonsemimartingale cases are $\alpha \in (-\frac{1}{2}, \frac{1}{2})$. \square

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_s \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

Recall that the *integrated variance* (IV)

$$\sigma_t^{2+} = \int_0^t \sigma_s^2 ds \quad (8)$$

is the main object of interest and that we wish to discuss the extent to which realised quadratic variation of Y can be used to estimate σ_t^{2+} .

Remark It is convenient to define σ_t^{2+} also for $t < 0$ by the same expression.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation
Ratio

Note that, as regards inference on σ^{2+} , there may be notable differences between cases where g is positive on all of $(0, \infty)$ and those where $g(t) = 0$ for $t > l$ for some $l \in (0, \infty)$.

- ▶ Recall that $\sigma \perp\!\!\!\perp B$.

Suppose $g(t) = 0$ for $t > 1$.

For any $t \in \mathbb{R}$ and $u < t$,

$$Y_t - Y_{t-u} = \int_{t-u}^t g(t-s) \sigma_s dB_s + \int_{-\infty}^{t-u} \{g(t-s) - g(t-s-u)\} \sigma_s dB_s$$

It is illuminating to rewrite this as

$$Y_t - Y_{t-u} = \int_{-\infty}^0 \phi_u(-v) \sigma_{v+t} dB_{v+t} \quad (9)$$

defining ϕ_u by

$$\phi_u(v) = \begin{cases} g(v) & \text{for } 0 \leq v < u \\ g(v) - g(v-u) & \text{for } u \leq v < \infty \end{cases}$$

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process**
- Examples
- RQV and IV
- Conditions ensuring $\pi_s \rightarrow \phi_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

This implies in particular that the conditional variance of $Y_t - Y_{t-u}$ given the process σ takes the form

$$\mathbb{E} \left\{ (Y_t - Y_{t-u})^2 \mid \sigma \right\} = \int_0^\infty \psi_u(v) \sigma_{t-s}^2 ds \quad (10)$$

where

$$\psi_u(v) = \begin{cases} g^2(v) & \text{for } 0 \leq v < u \\ \{g(v) - g(v-u)\}^2 & \text{for } u \leq v < \infty \end{cases} .$$

And unconditionally

$$\mathbb{E} \left\{ (Y_t - Y_{t-u})^2 \right\} = \mathbb{E} \left\{ \sigma_0^2 \right\} \int_0^\infty \psi_u(v) dv .$$

Hence

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes
Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation
Ratio

$$\frac{\mathbb{E} \left\{ (Y_t - Y_{t-u})^2 \mid \sigma \right\}}{\mathbb{E} \left\{ (Y_t - Y_{t-u})^2 \right\}} = \frac{\int_0^\infty \psi_u(v) \sigma_{t-v}^2 dv}{\mathbb{E} \{ \sigma_0^2 \} \int_0^\infty \psi_u(v) dv} = \int_0^\infty \bar{\sigma}_{t-v}^2 \pi_u(c)$$

where

$$\bar{\sigma}^2 = \sigma^2 / \mathbb{E} \{ \sigma_0^2 \} .$$

and π_u is the probability measure on $[0, 1]$ having pdf $\psi_u(v) / c(\delta)$ with $c(\delta) = 2 \|g\|^2 (1 - r(u))$ with r being the autocorrelation function of Y .

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Example $g(t) = e^{-\lambda t} 1_{(0,1)}$ (non-semimartingale case).

Then

$$\psi_\delta(v) = e^{-2\lambda v} \begin{cases} 1 & \text{for } 0 \leq v < \delta \\ (e^{\lambda\delta} - 1)^2 & \text{for } \delta \leq v < 1 \\ e^{2\lambda\delta} & \text{for } 1 \leq v < 1 + \delta \\ 0 & \text{for } 1 + \delta \leq v \end{cases}.$$

It follows that $\pi_\delta \rightarrow \pi$ where

$$\pi = \frac{1}{1 + e^{-2\lambda}} \delta_0 + \frac{e^{-2\lambda}}{1 + e^{-2\lambda}} \delta_1$$

where δ_x denotes the delta measure at x . \square

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation
Ratio

Example $g(t) = t^\alpha (1-t)^\beta$ with $-\frac{1}{2} < \alpha$ and $\beta \geq 1$.

The first inequality ensures existence of the stochastic integral $g * \sigma \bullet B$, and if α is less than $\frac{1}{2}$ then we are in the nonsemimartingale situation. In this case $\pi = \delta_0$. \square

Now, define the normed realised quadratic variation $\overline{[Y_\delta]}$ of Y as

$$\overline{[Y_\delta]} = \frac{\delta}{c(\delta)} [Y_\delta].$$

Then

$$\mathbb{E} \left\{ \overline{[Y_\delta]}_t | \sigma \right\} = \int_0^\infty \left\{ \delta \sum_{j=1}^{\lfloor t/\delta \rfloor} \sigma_{j\delta-v}^2 \right\} \pi_\delta(dv).$$

Suppose that π_δ converges weakly, as $\delta \rightarrow 0$, to a probability measure π on $[0, I]$, i.e.

$$\pi_\delta \xrightarrow{w} \pi. \quad (11)$$

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence
background

Ambit processes

Intermittency

BSS models
(cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter-
mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \pi_0$

Consistency

Feasible version

Further ongoing
work

Relaxing assumptions

Realised Variation

Ratio

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples

RQV and IV

- Conditions ensuring $\pi_\delta \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

Then we have

$$\mathbb{E} \left\{ \overline{[Y_\delta]_t} \mid \sigma \right\} \rightarrow \int_0^1 (\sigma_{t-v}^{2+} - \sigma_{-v}^{2+}) \pi(\mathrm{d}v). \quad (12)$$

In particular, if $\pi = \delta_0$, the delta measure at 0, then

$$\mathbb{E} \left\{ \overline{[Y_\delta]_t} \right\} \rightarrow \sigma_t^{2+}.$$

We will refer to this case by saying that the model for Y is *volatility memoryless*.

(Under a mild restriction the same holds for general g and σ provided the upper limit of the integral is taken as ∞ .)

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models

(cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

On the other hand, if π is a convex combination of the delta measure at 0 and I , i.e. $\pi = \theta\delta_0 + (1 - \theta)\delta_I$ for some $\theta \in (0, 1)$, then

$$\mathbb{E} \left\{ \overline{[Y_\delta]} \right\} \rightarrow \theta\sigma_t^{2+} + (1 - \theta) (\sigma_{t-I}^{2+} - \sigma_{-I}^{2+}).$$

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Suppose that $l = 1$ and that $g > 0$ is a square integrable continuously differentiable function on $(0, 1)$. If, as $\delta \rightarrow 0$, we have $c(\delta)^{-1} \delta^2 = o(1)$ and if the probability measure π_δ converges weakly to a probability measure π on $[0, 1]$ then π is concentrated on the endpoints 0 and 1 .

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

To formulate conditions ensuring that π exists and equals δ_0 , let

$$\Psi_\delta(u) = \int_0^u \psi_\delta(v) dv \quad \text{and} \quad \bar{\Psi}_\delta(u) = \int_{1+\delta-u}^{1+\delta} \psi_\delta(v) dv,$$

so that $c(\delta)^{-1} \Psi_\delta$ is the distribution function of π_δ .

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Proposition If $(\delta)^{-1} \delta^2 = o(1)$ and if for some $\varepsilon_0 \in (0, 1)$

$$\frac{\bar{\Psi}_\delta(\varepsilon)}{\Psi_\delta(\varepsilon)} \rightarrow 0 \quad \text{for all } \varepsilon \in (0, \varepsilon_0)$$

then $\pi_\delta \xrightarrow{w} \delta_0$. \square

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Remark In case $c(\delta) \sim \delta^2$ it may happen that π is absolutely continuous on $[0, 1]$.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Above it was assumed that $I < \infty$ (in fact, we took $I = 1$).
The following Example has $I = \infty$.

Example For $g(t) = t^\alpha e^{-\lambda t}$ ($\alpha > -\frac{1}{2}$) it can be shown,
using detailed calculations for this special case given in
[BNCP08], that $\pi = \delta_0$. \square

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

We now seek conditions under which the conditional variance of the normalised realised quadratic variation tends to 0 as $\delta \rightarrow 0$, i.e.

$$\text{Var}\{\overline{[Y_\delta]}|\sigma\} \rightarrow 0. \quad (13)$$

In that case and provided

$$\mathbb{E}\{\overline{[Y_\delta]}|\sigma\} \rightarrow \int_0^\infty (\sigma_{t-v}^{2+} - \sigma_{-v}^{2+}) \pi(dv) \quad (14)$$

holds we have that, conditionally on σ ,

$$\overline{[Y_\delta]}_t \xrightarrow{P} \int_0^\infty (\sigma_{t-v}^{2+} - \sigma_{-v}^{2+}) \pi(dv). \quad (15)$$

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Let $n = \lfloor t/\delta \rfloor$ and $\Delta_\delta^n Y = Y_{j\delta} - Y_{(j-1)\delta}$. Via the Cauchy-Schwarz inequality and using that for any pair X and Y of mean zero normal random variables we have

$$\text{Cov}\{X^2, Y^2\} = 2\text{Cov}\{X, Y\}^2. \quad (16)$$

it can be shown that

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

$$\text{Var}\{\overline{[Y_\delta]_t} | \sigma\} \leq 2K(\sigma)^2 \left(\delta + 2 \left(\delta \sum_{k=1}^{n-1} k \bar{c}_k(\delta) + \sum_{k=n}^{\infty} \bar{c}_k(\delta) \right) \right)$$

where $K(\sigma) = \sup_{0 \leq s \leq t} \sigma_s^2$ (as σ is assumed càdlàg,
 $K(\sigma) < \infty$ a.s.) and

$$\bar{c}_k(\delta) = \frac{c_k(\delta)}{c(\delta)} \quad \text{with} \quad c_k(\delta) = \delta \int_0^1 \psi_\delta((k+u)\delta) du.$$

Outline

BSS models

Definition

Key object of interest
Realised Quadratic
Variation

Turbulence background

Ambit processes
Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

Thus, for $\text{Var}\{\overline{[Y_\delta]}|\sigma\} \rightarrow 0$ to be valid it suffices to have

$$\delta \sum_{k=1}^{n-1} k \bar{c}_k(\delta) \rightarrow 0 \quad \text{and} \quad \sum_{k=n}^{\infty} \bar{c}_k(\delta) \rightarrow 0.$$

Example If $g(t) = t^\alpha (1-t)^\beta$ with $-\frac{1}{2} < \alpha$ and $\beta \geq 1$ then the above two conditions hold and $\overline{[Y_\delta]} \xrightarrow{P} \sigma^{2+}$. \square

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes
Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation
Ratio

$$\frac{[Y_\delta]_t}{[t/\delta] \{ \overbrace{\text{Var} \{ Y_0 \}} (1 - \hat{r}(\delta)) \}} \xrightarrow{P} \int_0^\infty (\sigma_{t-v}^{2+} - \sigma_{-v}^{2+}) \pi(dv).$$

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_\delta \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

So far we have assumed that $q = 0$ and $\sigma \perp\!\!\!\perp B$. In joint work (near completion) with José Manuel Corcuera and Mark Podolski these conditions have been substantially weakened. This more refined analysis has shown that $\overline{[Y_\delta]} \xrightarrow{P} \sigma^{2+}$ in wider generality and using the theory of multipower variation and recent powerful results of Malliavin calculus, due to Nualart, Peccati et al, a feasible CLT for $\overline{[Y_\delta]}$ has been established.

The results are further extended to consistency and feasible CLTs for multipower variations, in particular for bipower variation (as is essential for inference on σ^{2+}).

Above only the case of time-wise behaviour at a single point in space was considered. In the general turbulence setting, space and the velocity vector are three dimensional. There the questions, analogous to those discussed above, are substantially more intricate, major differences occurring

Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Amibit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_s \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio**

already for the case of a one-dimensional space component.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models

(cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_\delta \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation
Ratio

The *realised variation ratio* (RVR) is defined by

$$RVR_t = \frac{\pi [Y_\delta]_t^{[1,1]}}{2 [Y_\delta]_t}$$

where $[Y_\delta]_t^{[1,1]}$ is the bipower variation, i.e.

$$[Y_\delta]_t^{[1,1]} = \sum_{j=1}^{\lfloor t/\delta \rfloor - 1} \left| Y_{j\delta} - Y_{(j-1)\delta} \right| \left| Y_{(j+1)\delta} - Y_{j\delta} \right|.$$

The properties of RVR are presently under study in joint work with Neil Shephard.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow d_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio

► $r = g * g$?

► In non-semimartingale cases, can one give a natural meaning to $d[X]_t$ such that $d[X]_t = (dX_t)^2$?

► Volatility modulated Volterra Processes (VMVP):

$$Y_t = \int_{-\infty}^{\infty} K_t(s) \sigma_s B(ds)$$

$$Y_t(x) = \int_{-\infty}^{\infty} K_t(\xi, s; x) \sigma_s(\xi) W(d\xi ds)$$

► Relevance for Finance? Arbitrage?

Outline

BSS models

Definition

Key object of interest

Realised Quadratic Variation

Turbulence background

Ambit processes Intermittency

BSS models (cont.)

Canon

Semi- and non-semimartingale questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio



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Outline

BSS models

Definition

Key object of interest
Realised Quadratic
Variation

Turbulence background

Ambit processes
Intermittency

BSS models (cont.)

Canon
Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction
Increment process
Examples
RQV and IV
Conditions ensuring
 $\pi_t \rightarrow \hat{\theta}_0$
Consistency
Feasible version

Further ongoing work

Relaxing assumptions
Realised Variation
Ratio

Outline

BSS models

Definition

Key object of interest

Realised Quadratic Variation

Turbulence background

Ambit processes

Intermittency

BSS models

(cont.)

Canon

Semi- and non-semimartingale questions

Inference on intermittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$$\pi_s \rightarrow \delta_0$$

Consistency

Feasible version

Further ongoing

work

Relaxing assumptions

Realised Variation

Ratio



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Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on intermittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_t \rightarrow d_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation
- Ratio



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Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes
Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio



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Outline

BSS models

- Definition
- Key object of interest
- Realised Quadratic Variation

Turbulence background

- Ambit processes
- Intermittency

BSS models (cont.)

- Canon
- Semi- and non-semimartingale questions

Inference on inter-mittency/volatility

- Introduction
- Increment process
- Examples
- RQV and IV
- Conditions ensuring $\pi_s \rightarrow \delta_0$
- Consistency
- Feasible version

Further ongoing work

- Relaxing assumptions
- Realised Variation Ratio

Research Report 2007-2. Thiele Centre for Applied Mathematics in Natural Science.

Outline

BSS models

Definition

Key object of interest

Realised Quadratic
Variation

Turbulence background

Ambit processes

Intermittency

BSS models (cont.)

Canon

Semi- and
non-semimartingale
questions

Inference on inter- mittency/volatility

Introduction

Increment process

Examples

RQV and IV

Conditions ensuring

$\pi_s \rightarrow \delta_0$

Consistency

Feasible version

Further ongoing work

Relaxing assumptions

Realised Variation

Ratio