# Insights into UK investment firms' efforts to comply with MiFID II RTS 6 that governs the conduct of algorithmic trading

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Some professional insights into UK investment firms' efforts to comply with the provisions of MiFID II RTS 6 that govern firms' conduct of algorithmic trading

#### 1. Introduction

On 3<sup>rd</sup> January 2018 the second Markets in Financial Instruments Directive ("MiFID II") entered into force in the European Union ("EU"). MiFID II introduced EU-wide organisational requirements for firms engaged in algorithmic trading (hereinafter, "AT") for the first time (Schu and Lee, 2022). Capturing trading "where a computer algorithm automatically determines individual parameters of the orders with limited or no human intervention" (Schu and Lee, 2022), the reforms sought to address anxieties caused by events such as the Flash Crash (Busch, 2016). Largely enshrined in Commission Delegated Regulation 2017/589 (still commonly referred to as "RTS 6", the abbreviation for "Regulatory Technical Standard 6", the regulation's pre-adoption name), the requirements prescribe the implementation of pre- and post-trade controls to fulfil the aspirations of Article 17 MiFID II. These include: requiring firms to devise clear methodologies for the testing and deployment of algorithms, the establishment of change control processes, annual assurance, setting price collars<sup>1</sup> and execution throttles<sup>2</sup> and the employment of real time risk monitoring. That these requirements were enacted by a delegated regulation rather than through its parent directive (MiFID II) was intentional<sup>3</sup>. Policymakers sought to limit scope for variation in their interpretation between EU Member States, some of whom were perceived to be pro-innovation (particularly the UK, Ireland and the Netherlands) and others sceptical thereof (particularly France and Italy) (Karremans and Schoeller, 2020).

Central to the aims of RTS 6 is the mitigation of conduct risk<sup>4</sup>(Culley, 2020) (Stangl, 2015). For example, Article 5 states that the prevention of disorderly conduct motivates the "behavioural testing" of order execution algorithms (Raschner, 2021). However, supervisors do not have the resources to fully scrutinise firms' AT environments. Accordingly, RTS 6 places reliance on human oversight performed

 $<sup>^{1}</sup>$  For a definition, please see the section entitled "Pre and post trade controls (Articles 15 and 17, RTS 6)".

<sup>&</sup>lt;sup>2</sup> Per note (1), above.

<sup>&</sup>lt;sup>3</sup> In the EU regulations are directly applicable in Member States, i.e. they do not need to be transposed into domestic legislation. By contrast, a directive only becomes applicable in a Member State once that state has transposed it through the enactment of national legislation.

<sup>&</sup>lt;sup>4</sup> For a definition of "conduct risk" considered in the context of AT, see Culley (2020).

by firms' senior managers and control functions in lieu of constant external supervision, e.g. by a regulator or trading venue<sup>5</sup> (Schu and Lee, 2022) (Stangl, 2015). Consequently, the quality of that oversight is heavily dependent on firms' recruitment, training and organisational structure (Stangl, 2015). RTS 6 was retained in the UK after the end of the Brexit Transition Period. The UK Financial Conduct Authority ("FCA") has supplemented RTS 6 with its own guidance to wholesale trading firms (2018). Some argue that this has gone further than RTS 6 in expressly demanding that firms "do more work to identify and reduce potential conduct risks created by their algorithmic trading strategies".

Drawing upon insights gained from practitioners upon whom MiFID II's effective implementation is so dependent, this article seeks to analyse UK investment firms' efforts to comply with RTS 6. This article's specific focus is the substantive provisions of RTS 6 governing algorithmic deployment (found in Chapters I and II). Accordingly, this paper does not address business continuity (Article 14), security (Article 18), direct electronic access (Chapter III, covered elsewhere, for example in Culley (2022)) or the additional controls that clearing members must implement (Chapter IV). This paper finds practitioners have a good understanding of the requirements in RTS 6, even if some lack knowledge of algorithms, coding and algorithmic strategies. Interviewees' firms have, in the main, used best efforts to implement RTS 6 and broadly support its aims. Fatigue, complacency, cost pressures, an overreliance on external knowledge and generous risk parameter calibration pose the greatest risk of undermining the effectiveness of firms' controls.

The remainder of this paper is structured as follows. First, a literature review considers previous analyses of MiFID II's AT regime. This review helped to identify the opportunity for further research that is the subject of this article. Second, the methodology used to conduct the research is stated. The third section details the findings from the research. The findings are set out under each of the specific provisions of RTS 6 to which they relate. Next, a discussion section relates the paper's findings to those of previous works studied in the literature review. This section also makes some recommendations for practice, regulatory reform and future research. Finally, a conclusion summarises the paper's implications for the future performance of AT in the UK.

<sup>&</sup>lt;sup>5</sup> Commission Delegated Regulation (EU) 2017/584 (still commonly known as "RTS 7" to MiFID II) requires EU based trading venues permitting AT to adopt a range of systems and controls to mitigate the risks arising therefrom. RTS 7 is outside the scope of this article.

#### 2. Literature review

MiFID II and particularly its regulations governing AT have hitherto been under researched topics in the financial market literature (Karremans and Schoeller, 2021). Early analyses have predominantly, but not exclusively, been conducted through: (a) a legal lens; and (b) are not based on original empirical data. To date, these critiques offer evaluations of MiFID II's AT regime from one of two broad perspectives. The first, a macro-regulatory perspective, considers, for example, whether: (a) the scope of the AT regime should be extended to cover order routing as well as execution and investment decision making algorithms (Pereira, 2020); and (b) developments in artificial intelligence ("AI") are already rendering it obsolete (Azzutti, 2022). The second, a micro-regulatory perspective, considers, for example, whether (a) the self-testing of algorithms pursuant to Article 7(3) RTS 6 is desirable from a public policy perspective (Raschner, 2021); or (b) RTS 6's annual notification requirement is too generous to keep pace with firms' constantly evolving business models (Comana et al., 2019). An initial analysis of the MiFID II AT package contended that it was too premature to draw conclusions about how market participants would receive it, i.e. at the micro-regulatory level (Woodward, 2017).

This study's focus is micro-regulatory: how investment firms which have been dubbed the "first line of defence" in the oversight of AT (Azzutti, 2023) have grappled with the operational requirements in RTS 6. Accordingly, the remainder of this literature review will focus on other contributions that have sought to weigh the effectiveness of RTS 6's AT related provisions.

The AT regime in RTS 6 was forecast to impose significant compliance costs on investment firms (Yeoh, 2019). This is because RTS 6 places reliance upon firms to act as gatekeepers (Čuk and Van Waeyenberge, 2018). The technical resources and expertise required to comply with RTS 6 could act as a barrier to entry that inadvertently benefits larger firms (Čuk and Van Waeyenberge, 2018). Furthermore, it is argued by some that the regime's complexity frustrates consistent application (Sadaf et al., 2021). European legislators may have underestimated the impact of certain provisions in MiFID II's AT package on firms deploying simpler order execution algorithms (Conac, 2017).

Constrained by technical and knowledge limitations, investment professionals are compelled to operationalise the rules in ways that undermine their effectiveness (Sadaf et al., 2021). For example,

<sup>&</sup>lt;sup>6</sup> In traditional audit practice, a firm's "business areas are the first line of defence" in a "three lines of defence model" where the second and third lines refer to the control and internal audit functions respectively (Bank of England, 2023).

algorithms are categorised subjectively for the purposes of determining the rules that apply to them (Lenglet, 2011). However, given that regulators are even more remote from firms' algorithmic processes granting some latitude regarding how to apply the requirements enshrined in RTS 6 was a necessary compromise (Seyfert, 2021). This was the key driver for MiFID II's designers opting for a more principles-based approach to its construction, as opposed to the rules based approach taken in its sister initiative, the Market Abuse Regulation ("MAR") (Sadaf et al., 2021). A case in point is MAR's prescriptive approach to defining what constitutes market manipulation in the context of high frequency trading ("HFT")<sup>7</sup>, whereas MiFID II holds that anyone involved in the deployment of trading algorithms could, in principle, be held responsible for such behaviour (Čuk and Van Waeyenberge, 2018).

In the UK which is perceived by some observers to favour "light touch" regulation, political dynamics are likely to encourage even more decentralisation in the implementation of RTS 6 than in many other European states that remain members of the EU (Karremans and Schoeller, 2021). Still, the UK is one of the few jurisdictions in Europe whose competent authorities and trading venues are known to have intervened where weak control environments that relate to matters of the kind outlined in RTS 6 have been detected (Schu and Lee, 2022). Notable examples include: (i) ICE Futures Europe taking disciplinary action against Allston Capital LLC (2022a) for failing to prevent its employees from engaging in disorderly trading in Euribor and Gilt futures using trading algorithms; and (ii) a firm adjusting its algorithm and control framework in response to concerns raised by the FCA's surveillance unit (2021t). In addition, the FCA has built on RTS 6 by issuing good practice guidelines that encourage firms to: (i) maintain inventories of their algorithms and associated risk controls; (ii) perform due diligence to identify conduct risks posed by their algorithms; and (iii) assign a dedicated project manager to oversee such processes (Schu and Lee, 2022). Moreover, in doing so, the FCA makes a clear connection between RTS 6 and its expectations basis the Senior Managers and Certification Regime ("SMCR") (Schu and Lee, 2022). The SMCR imposes standards of accountability on firms' key employees that are currently unique in Europe (2023a). This is significant given that, paradoxically, some commentators have asserted that the complexity of RTS 6's requirements has increased conduct risk (Stangl, 2015).

Challenges associated with the practical implementation of exacting AT related legislation were explored by Coombs (2016) in the context of Germany's Hochfrequenzhandelsgesetz (English "High Frequency Trading Act", hereinafter "German HFT Act")(2021p). Widely acknowledged as the inspiration for much of RTS 6 (Karremans and Schoeller, 2021; Seyfert, 2021; and Lenglet and Mol,

<sup>&</sup>lt;sup>7</sup> Per Autoriteit Financiële Markten (2023) "a technique that allows for extremely fast signal processing and/or order execution".

2016), the German HFT Act entered into force in 2013. Drawing upon data collected from 15 individual and group interviews with key stewards in AT governance processes, including compliance officers, IT (Information Technology) staff and regulators, Coombs's study found that:

- (1) some small enterprises were openly non-compliant with obligations imposed by the German HFT Act because of a lack of understanding concerning the functioning of algorithms developed by third parties;
- (2) "creative interpretation" of the German HFT Act's rules is commonplace, particularly with regards to the "tagging" and notification of algorithms, leading to inconsistencies between firms; and
- (3) notification requirements often struggle to keep pace with the evolution of algorithms, undermining their utility to regulators; but
- (4) despite some of its shortcomings, some believed the German HFT Act had had a "professionalising impact" on the culture of proprietary HFT trading firms.

Although it does not pertain to MiFID II, Coombs's research offers insights into the possible challenges, and benefits, arising from the implementation of RTS 6. Given that many start-ups labour under tight resource constraints (Sheridan, 2017), Coombs's findings continue to be relevant to firms grappling with the pan-European RTS 6.

The dearth of academic research into the functioning of RTS 6 has not precluded the European Securities and Markets Authority ("ESMA") from conducting its own consultation into the functioning of the MiFID II's AT regime (2021u). ESMA's review was wide ranging. This paper's focus is solely investment firms' feedback on the elements of RTS 6 that directly govern their AT operations. First, to avoid uncertainty, most respondents were in favour of retaining the current definition of AT in RTS 6. A minority saw value in making a distinction between "simple" and "complex" algorithms, arguing that this would aid a more proportionate application of RTS 6's requirements. Based on the feedback received, ESMA decided against making any changes to the definition of AT. Second, most respondents were in favour of improving RTS 6's "behavioural testing" regime, primarily to make it more realistic.

<sup>&</sup>lt;sup>8</sup> "Tagging" refers to the practice of assigning an algorithm a unique identifier so an investment firm retains a clear audit trail of when it has been used to execute a transaction. This practice was incorporated into EU wide legislation through Article 9 Commission Delegated Regulation (EU) 2017/590.

It was widely felt that current stress testing obligations were conducive to generating artificial, and therefore, unhelpful results. Allowing for greater interaction between test and production environments<sup>9</sup> as well as promoting consistency between the test environments offered by trading venues were among the proposals made to address this. To reduce the possibility of conflicts of interest undermining testing, some called for testing to be performed by a dedicated team independently of developers. Third, participants in the review were not in favour of ESMA defining "disorderly trading conditions" as it was thought that this might not accommodate the myriad differences between different market structures and trading styles. Finally, many practitioners felt that the annual self-assessment requirements in RTS 6 suffered from a lack of guidance, leading to varied output that is of questionable use to national competent authorities. Even so, there was a consensus against the introduction of a templated self-assessment that could lead to the genesis of a "one sized fits all" "box ticking" approach across firms and markets.

An extensive review of the UK's onshored<sup>10</sup> AT regime was absent from the HM Treasury's recent Wholesale Markets Review (2022i). An examination of the FCA's latest Regulatory Initiatives Grid published in May 2022 (2022f) suggests that a review of the UK's AT regime like that conducted by ESMA has not been in UK authorities' immediate plans. It remains to be seen whether "Big Bang 2.0"<sup>11</sup>, originally advanced by Prime Minister Rishi Sunak whilst serving as Chancellor with the intent of boosting the UK's competitiveness as a global hub for financial services (Parker et al., 2022), will prompt a change in this position. Yet, UK regulators have recently solicited views on whether to refine or extend it to meet challenges posed by the growth of AI in financial services (2022c).

Concerns about the transparency and "explainability" of models are among the AI related challenges that have become a source of anxiety for regulators. Often referred to as the "black box problem" (Azzutti et al., 2023), related knowledge gaps are perceived to undermine the effectiveness of articles 2 and 3 in RTS 6. These articles require that staff have a minimum level of understanding as to how a firm's AT systems operate (2023d). Some commentators such as Azzutti et al. (2023) forecast the imminent displacement of rules based, human calibrated, execution and trading algorithms by algorithms which use the output from machine learning models to trade (2023d). If this were to materialise, it would be very difficult for firms to observe the principle of accountability which is so fundamental to RTS 6. Be that as it may, there is a consensus among practitioners that AI dominated

<sup>&</sup>lt;sup>9</sup> A "production environment" refers to the deployment of an algorithm in live trading.

<sup>&</sup>lt;sup>10</sup> Refers to EU legislation retained by the UK after the end of the Brexit Transition Period.

<sup>&</sup>lt;sup>11</sup> The original "Big Bang" refers to reforms instigated by Prime Minister Margaret Thatcher's Government to liberalise access to the UK's securities markets in the 1980s.

markets are far from a reality. At the time of writing, rules based algorithms continue to predominate in trading, with many machine learning models still relatively immature (2023b) (Culley, 2022) (Gozman et al., 2019).

#### 3. Methodology

This paper aims to assist in reducing the existing gap in understanding, identified by scholars such as Woodward (2017), regarding: (a) how investment firms have interacted with RTS 6 since its implementation; and (b) associated implications for the AT regime's effectiveness.

The paper focuses on UK investment firms' efforts to comply. Most firms that would have been subject to RTS 6's requirements when it was promulgated on 3<sup>rd</sup> January 2018 would have been based in the City of London. Whilst the Brexit Transition Period ended at midnight on 31<sup>st</sup> December 2020, the findings of the literature review suggest that there has not yet been any significant divergence between the EU and UK approaches to implementing RTS 6. Some divergence is possible as ESMA acts in response the findings from its review into the AT regime. Nevertheless, this paper's findings should still be insightful for practitioners and regulators working in EU Member States. In particular, future researchers could compare the findings herein to the practices of firms active in EU Member States. This could help test for potential differences in the firm level implementation of MiFID II's technical standards, a possibility raised by Karremans and Schoeller (2020).

Insights were obtained from 19 practitioners working for, or with, UK investment firms between Spring-Summer 2021 using semi-structured interviews. Headline topics were prepared in advance but questions were not scripted to facilitate flexible and natural discussion. The topics included:

- investment firm sector/sub-sector and goals;
- design, deployment, (re) calibration processes;
- surveillance tools currently used;
- staffing, and the ability of staff to spot conduct events caused by algorithmic activity; and
- the effectiveness of the UK's approach to mitigating algorithmic conduct risk.

Interviewees were recruited from the author's professional network, including personal connections and second degree connections to whom the author was referred. Interviewees were selected for their knowledge of: (a) AT as conducted by investment firms; and (b) the regulatory framework that governs it. Participants included:

• 13 senior personnel employed by investment firms (a chairman, a chief executive officer, two chief compliance officers, the founder of a quantitative hedge fund manager, two heads of

anti-financial crime functions, a chief risk officer, senior sales, and distribution professionals, two heads of a front desk, and a senior surveillance officer);

- three regulators who were recently involved in the supervision of firms that deploy algorithms;
- two trade surveillance experts: one working for a firm and another who works for a technology vendor that supplies market abuse monitoring tools to firms; and
- a third party algorithmic trading expert who regularly assists firms in strengthening their systems and controls.

Adopting the classification of different AT operations outlined by the Dutch regulator (the Autoriteit Financiële Markten (2023d)<sup>12</sup>), the activities of the investment firms from which the participants were drawn include:

- automated traders (use algorithms to automate a proprietary trading strategy for a fund or own account):
  - a quantitative hedge fund (subject to the provisions of RTS 6 indirectly as a "taker" of liquidity from sell side firms);
  - an algorithmic market maker;
- automated executors (use algorithms to execute clients' orders intelligently):
  - five brokerages active in transacting in a mixture of asset classes for a broad range of wholesale and, in some cases, retail, clients using electronic and traditional channels, for example using voice telephony; and
  - o a retail brokerage (using online platforms).

As has been highlighted in earlier research into AT that seeks access to operational insiders, particularly Culley (2022) and MacKenzie (2018), obtaining that access is challenging. This also applies if a researcher is seeking engagement from an extensive professional network, as in the author's case. Time constraints, concerns about confidentiality and claims of insufficient knowledge were advanced by some who were invited to participate. The research project received approval from the Ethics Committee at the author's university. Approval was conditional upon participants being: (a) guaranteed anonymity; and (b) provided with an information sheet prior to committing. This was not enough to reassure everyone, however. Notwithstanding this, the author managed to gain the trust of a sufficient number of practitioners so that this obstacle did not seriously limit the study's findings.

<sup>12</sup> Selected for recency (published in 2023). Furthermore, the Netherlands is widely reported to be the UK's main rival as the European destination of choice for AT firms post-Brexit. Accordingly, Dutch regulatory initiatives pertaining to AT are likely to be highly influential in the UK and vice versa.

As the UK was subject to COVID restrictions at the time the author sought to conduct the interviews, all were held remotely, primarily using Microsoft Teams. The interviews were recorded and transcribed using Nvivo software. Once transcribed, Nvivo was also used to assign codes to segments of the interviews, making it possible to identify common themes.

This paper forms part of a broader project that seeks to examine the identification and mitigation of conduct risk in AT. The research design adopts that set out in Culley (2021). The interview protocol is included in the Appendix.

#### 4. Findings

This paper's findings are structured to address specific AT related requirements in RTS 6, where these were commented on in sufficient detail by participants.

#### (i) Role of the compliance function (Article 2, RTS 6)

Article 2(1) requires investment firms to ensure that the compliance personnel have, as a minimum, a "general understanding" of their AT operations. Additionally, compliance personnel must be in "continuous contact" with those persons within a firm who possess expert knowledge of its algorithms and related systems. A senior compliance professional appeared unconvinced that his firm had achieved compliance with Article 2(1):

"I think knowledge is siloed at the moment. And for the most part, I think that...very few people outside of the front office and developers would understand in basic terms what each algo did." (2021h)

Several professionals said their firm had tried to use the FCA recommendation to maintain a register of algorithms to improve understanding (2021f) (2021h) (2021s). Opinion was that these are only partially effective because maintaining them in "layman's terms...still requires a certain level of knowledge" (2021h) and "...perhaps sometimes [people] just take them for granted." (2021s).

Another compliance professional who had spent time at several firms in senior roles before and after the implementation of MiFID II concurred with the sentiments of his counterpart, suggesting that "continuous contact" of the nature demanded by Article 2(1) may be counterproductive:

"the compliance people are the second line of defence, and I don't know if they'll be good enough to catch capture of the algorithms can do because most compliance people don't come from an algorithmic trading background. So they're only going to go what they're told by the programmer, not really an independent sort of second line of defence check there." (2021o)

To reduce reliance on other functions, this compliance professional had sought to recruit directly from other areas of the business:

"...clearly not everybody would make it on the trading floor. But it means it doesn't mean to say they're not very good at understanding what was going on. Maybe it wasn't for them. So I think the almost the best sort of monitors would be from people who have done the underlying program and or done the underlying trading.[sic]" (2021o)

Interviewees from other functions (for example, trading or operations) agreed, contending that oversight functions are "lagging behind" (2021a) front office functions who "would pull the wool over the eyes of compliance people..." (2021l). One even exhibited resistance to compliance staff being involved in the supervision of AT activities at all, exclaiming: "How closely do we want them [surveillance staff] involved in our trading activity?" (2021f). Compliance staff in smaller firms are inclined to agree since they often struggle to manage competing priorities such as dealing with complaints and financial promotions (2021i).

Article 2(2) requires that compliance functions be provided with either direct or indirect access to functionality used to "kill", or switch off, unexecuted orders (see "kill functionality", below). Whereas numerous participants stated or intimated that their firms had a kill switch, the subject of access to it was not raised in the interviews. The exercise of kill functionality would probably be a delicate event due to the possible economic and reputational consequences for a firm and their customers alike. Therefore, this might suggest that neither the participants nor their firms have ever been in a live or test situation requiring exercise. Then again, it is possible that reputational concerns simply inhibited forthright discussion of this.

#### (ii) Staffing (Article 3, RTS 6)

Article 3 RTS 6 stipulates that firms shall maintain adequate human resources to manage their AT operations. In particular, Article 3(1) states that staff must have "sufficient technical knowledge" of:

- (a) "the relevant trading systems and algorithms;"
- (b) "the monitoring and testing of such systems and algorithms;"
- (c) "the trading strategies that the investment firm deploys through its algorithmic trading systems and trading algorithms;" and
- (d) "the investment firm's legal obligations."

Apropos these obligations, one participant said that regulators should require that staff involved in the performance of algorithmic related operation sit examinations:

"I would be very keen to see exams come in pertinent to algorithmic trading and being able to monitor and stay on top of what's going on." (2021o)

The FCA does currently prescribe examinations for persons involved in certain retail client facing activities, for example, the provision of investment advice. Such requirements do not, however, currently extend to wholesale trading activities.

In addition to, or instead of, requiring that persons supervising AT operations obtain specific qualifications, some firms seek to recruit expertise from their commercial ranks. An interviewee said:

"I think the almost the best sort of monitors would be from people who have done the underlying program and or done the underlying trading....[accordingly] my natural inclination would be to sort these people from the trading floors or the programming floors. In other words, almost like a career path." (2021o)

A regulator charged with overseeing firms' algorithmic practices said that he had been:

"...advocating here that on every board of at least certainly the large brokers that we deal with that they should have ahead of it [algorithmic trading]. That is prominent in a position that sits on and understands those risks to the firm...So I've gotten a bit of pushback here about that, saying we should be pushing telecom firms what the makeup of their board, but I've been increasingly arguing that brokers are becoming I.T. companies." (2021d)

On the ability to maintain knowledge of applicable legal obligations, a participant said:

"I think the knowledge base within firms sometimes is not going at the same pace. And it's not because of anything, you know, it's a problem with the firm. It's just that the regulatory framework is constantly playing catch up to the new technology that's coming in." (2021q)

Another suggested that internal training programmes that seek to promote knowledge of applicable legal obligations should be broadened to include persons in non-revenue generating roles:

"I think it's most likely to be borne out of a lack of understanding from the guys developing these algorithms as to what market abuse could look like. Traditionally, market abuse has been something that training programmes have focused very much on the front office and the guys that are developing these algorithms have the potential to have a far greater impact on the market.." (2021h)

Too much, or poorly focused educational initiatives risk "regulatory fatigue" and concomitant disengagement though. One c-suite level senior manager insisted that tracking "continuing developments" in the AT arena:

"may overburden the responsibilities of those people who are managing the business, and that in itself is potentially a risk..." (2021j)

### (iii) IT outsourcing and procurement (Article 4, RTS 6)

Article 4(1) makes clear that firms continue to retain regulatory responsibility for any outsourcing or use of third party vendor technology in the context of AT. This is a well-established principle of wider UK financial regulation. This probably explains the lack of comment about Article 4(1) in the interviews.

Article 4(2) demands that firms are sufficiently knowledgeable about any outsourced or vendor supplied AT solutions they procure. This is relevant to most investment firms because unlike "tier one investment banks" they often lack the resources to develop AT systems themselves:

"Well... we would love...not [to] outsource, but we would look to third parties to provide the technology predominantly because of the development resource there would need to go into developing a suitable system or framework." (2021h)

Investment firms' reliance on external vendors poses opportunities and challenges. Efficiency was cited as a significant advantage of this model (2021q). One participant averred:

"I just think it's more efficient for a technology vendor to roll out one change process for a change in regulation that...100 clients can benefit from than it is for those 100 clients each to replicate that effort." (2021h)

Conversely, an alleged consolidation of vendors is putting pressure on firms' budgets:

"Costs are spiralling upwards from just because they are...[dependent upon]...the same sort of single actor...you know, it's the guys who sell the shovels and make money during managing the gold rush. I think in that scary space where there's only a few vendors left in the industry because they've acquired everyone else who dominated. [sic]" (2021m)

Such cost pressures may encourage some firms to become too dependent on the knowledge and expertise of their AT related system vendors, particularly if they have smaller financial or non-financial resources at their disposal.

It is common for UK investment firms to be controlled by foreign actors in international conglomerates. One interviewee implied that this poses a challenge to ensuring compliance with obligations such as those enshrined in Article 4(2):

"...where I'm working now [we] are highly dependent on decisions coming from outside the UK and from a regulatory environment that are completely different from the UK...in this particular case, it is the US...Any decisions that relate to [procuring] new I.T. or to get new suppliers are made at group level. [sic]" (2021n)

(iv) Testing, deployment and review of AT systems and strategies (Sections I-2, RTS 6) Section I of RTS 6 sets out detailed requirements for the development and testing of algorithms, AT systems and strategies (together "AT systems"). To summarise, these include:

- oversight: designating a senior manager as being responsible for authorising the deployment or substantial update of a AT system, and ensuring the appropriate allocation of responsibilities for performing the processes outlined in Section I;
- recordkeeping: ensuring the firm's AT launch and change management processes are fully documented;
- conformance testing: to minimise the risks of flawed interaction, testing the conformance of AT systems with the systems of a relevant trading venue, for example in the case of initial deployment or material updates;
- using dedicated testing environments: to conduct pre-production testing; and
- **setting pre-defined limits**: on the "number of financial instruments being traded," "price, value, and numbers of orders," "strategy positions" and "number of trading venues to which orders are sent."

The core objective of the requirement in Section I is to reduce the risk of errant AT contributing to disorderly market conditions.

According to Section 2, post-deployment management is comprised of three components:

- (1) **annual self-assessment and validation (**Article 9): of a firm's compliance with RTS 6 and AT systems and strategies;
- (2) **stress testing** (Article 10): of AT systems and controls under simulated conditions of stress or increased order traffic; and
- (3) management of material changes (Article 11): to ensure robust review prior to release into production.

Several interviewees spoke of their firms' interaction with the "normally...quite prescriptive conformance testing" operated by trading venues. Participants commented on the limitations of strict conformance testing, particularly where a firm is tasked with scrutinising their clients' AT systems.

These limitations include: (i) limited visibility, because clients are protective of their intellectual property; and (ii) an inability to carefully scrutinise vast amounts of code (2021m). One critic of conformance testing went further to argue that it was encouraging the surveillance departments of exchanges to become fixated on process failures at the expense of pursuing actual market abuse:

"I'm just thinking the exchanges...if they do take action against... an algorithm, it tends to because it's placing too many orders or they someone tested an algorithm in live, that type of issue, as opposed to a genuine for six months we saw this complete abuse.[sic]" (2021o)

Another postulated that mandatory conformance tests could encourage an unthinking approach to risk management:

"You've almost got to...do a technical KYC (Know Your Customer) on each client from that perspective and even each algorithm...You can't just say we adhere to the venue conformance testing...that would just tick boxes. We have our own conformance testing to a much higher level. [sic]" (2021f)

To this end, several participants stated that their firms operated exacting processes to understand algorithms prior to sign off and deployment. Carefully managing the relationship with vendors (2021f), this involves testing, taking the following factors into account:

- the proposed strategy and, if relevant, a client's objectives;
- the potential impact on the market, particularly from a conduct perspective; and
- in the event of proposed changes to existing algorithms, whether these are material and, if so, would necessitate: (a) additional stress testing; and (b) the submission of prior notification to relevant trading venues. Even apparently minor changes to an algorithm require scrutiny because they could alter how a trader interacts with them (2021h) (2021o) (2021s).

Others were less certain about their firms' systems and controls. One blamed a "lack of understanding of the regulations" for undermining efforts to comply:

"...I think one month before going live [3<sup>rd</sup> January 2018] basically they hired a consultancy firm and asked [them] to just do the minimum requirements that

were needed...[sic]" (2021n).

Complexity was mentioned as a factor that can frustrate recordkeeping efforts:

"...a lot of [machine learning] decisions [are] so complex [that] they're very difficult to track and...they don't have a very clear audit trail..." (2021a)

An inability to read code could limit the usefulness of reviews performed by control functions. However, this weakness may eventually disappear as personnel become more technically proficient:

"I've been heavily involved in algorithmic compliance for a lot of my career, but I can't read code. So let's be completely straight: [one can only be so useful]...when you're trying to attest to the conduct of your algorithm...it's probably a good thing that you're seeing a lot more people who enter into the market now with Python experience...so you're going to get more people in control functions with that [experience]...[sic]" (2021s).

Despite these impediments, interviewees could not recall any incidents emanating from a failure of pre-deployment controls:

"I don't think of any significant conduct issues that have [arisen because] an algorithm has been mishandled or poorly signed off." (2021s)

Nonetheless, one interviewee said the deployment processes were integrated with his firm's operational risk framework. This setup allows his firm to: (a) identify the root causes of any issues arising; and (b) learn from them to make refinements (2021i).

The annual self-assessment and validation process was not thought to be something which "represents a significantly greater constraint than any other particular regulation" by a regulator interviewed for this study (2021c). However, a consultant who specialises in assisting firms achieve compliance with AT obligations claimed to have witnessed significant differences with the expectations and approaches of an overseas regulator (the US Securities and Exchange Commission ("SEC")) and the FCA to annual reviews. One example he gave was of a greater focus of the SEC on the potentially toxic interactions of algorithms (2021a). The implication was that, by contrast, audits in the UK tend to be more process focused, for example examining monitoring that is undertaken or

whether elements of an AT programme have been "signed off" properly (2021i).

#### (v) Kill functionality (Article 12, RTS 6)

As outlined in subsection (i), several interviewees declared their firms have a "kill switch" to stop trading that could bring the market "into disrepute" (2021j) (2021a) (2021l).

The form "kill functionality" takes between firms appears to vary, based on some interviewees' responses. For some, a "kill switch" is a chain of direct human intervention:

"You know, in terms of intervening...if there was any disorderly markets...on the investment side, I've seen the...industry...move towards...not using [the] kill switch as a last resort, but actually more of a sort of more human intervention early on.[sic]" (2021a)

For others, the "kill switch" is either integrated with the automated trading process (2021a) or non-existent:

"I don't need to worry about this [because] we're not dealing on our own account.... So... we don't have a kill switch per se..." (2021k)

The lack of a significant AT related "event" during the volatile period triggered by the world's response to the COVID-19 pandemic could be fuelling complacency. An expert in trade surveillance mused whether kill switches were still relevant:

"...if you think about some of the really noxious things that we've seen in the last couple of years...with regards to the pandemic...you're still not seeing the kind of spikes that flash crashes that we used to see back in the early noughties. Again, [its] mainly because a lot of these [algorithms] are now better coded...they know when to pull out of the market or...they've got kill switch....I don't know. It's just a personal feeling. You just feel like you see less of this stuff at the moment that you have done in the past. [sic]" (2021s).

A regulator who was heavily involved in the supervision of AT firms was asked if he could ever envisage the FCA taking over responsibility for activating a "kill switch" given the potential inconsistencies in firms' approaches:

"...it's [firms' maintenance of a kill switch] never going to be quite as good as a regulator because...we get in theory...the whole view...we can get across on different exchanges and get some asset classes, whereas they [firms and trading venues] can't. But I think it's a long way off before regulators got a kill switch...I don't honestly believe [we] would see it that quickly...to be able to react to it." (2021b)

(vi) Automated surveillance system to detect market manipulation (Article 13, RTS

6)

Investment firms are required by Article 13 to establish and maintain an automated surveillance system to monitor orders and transactions submitted through its trading systems for potential indications of market abuse. The system used must be appropriate to the size, nature and scale of a firm's trading activities and current regulatory obligations. Alerts generated by the system must be generated on a trading day plus one ("T+1") basis. Firms are obliged to calibrate their surveillance systems to minimise the generation of false positives or negatives. Calibration should also compare the completeness of trade and account information, particularly when reconciled with the records of trading venues, clearing houses and other key counterparties.

Automated surveillance systems pair a firm's trading activities with externally sourced market data. If the system detects a divergence, or suspicious relationship, between the firm's activities and those in the wider market, an alert is generated. However, firms regularly protest that market data is too expensive (2022d). Trading venues are alleged to "abuse" their privileged position to charge high fees. Faced with high costs and diminishing returns, investment firms are tempted to invest the bare minimum in non-revenue generating systems and controls:

"When you are a brokerage firm and you see the license prices, they have to pay for all the data that's going to go through, which is not your own data. This is the data from outside, uh, from the outside world. Basically, the majority of the time they try to cut corners as much as possible [sic]." (2021n)

Regulators insist that firms calibrate surveillance tools to meet challenges posed by their specific business models. All the same, the costs and difficulty of procuring bespoke systems (2021d) encourages firms to implement sub-optimal solution. This is especially the case as algorithms based on Al increase in popularity:

"I haven't seen many tests that are up to that point [monitoring AI powered algorithms] yet... [although] that doesn't mean that they are missing transactions in any way" (2021r)

#### (vii) Real time monitoring (Article 16, RTS 6)

Article 16 mandates that an investment firm routing orders to trading venues monitors all trading activity taking place "under its trading code" for indications of "disorderly trading". This obligation extends to the activities of an investment firm's clients that utilise a firm's trading code. Article 16 requires the monitoring to be performed both at desk level and by an independent risk control function. The system used to perform the monitoring has to produce alerts within five seconds of the detection of potentially disorderly trading.

Participants were unconvinced about the usefulness of real time monitoring. One trade surveillance professional at a software vendor that supplies investment firms said:

"Yeah, we support real time...I prefer T+1 [monitoring] myself, because...you're able to analyse the data [prior to] the event as well...So... if I was looking at something like a price ramping alerts, I may want to look at what happened to the price in the instrument after the price and event had taken place....whereas with real time, I find that you just [what is there] at that time....[sic]" (2021r)

#### He continued:

"There are some, there are some clients that take the real time, but it seems as though they use the real time for different uses, a more transaction monitoring, position monitoring and certain things like that, rather than the traditional surveillance T plus one surveillance monitoring." (2021r)

Another inferred that his firm had developed basic functionality to meet the requirement:

"We have both...real time surveillance, we have an in-house system and that that only looks at the rapid increase in older activity, so that's quite a crude surveillance tool, I would say." (2021h)

A very experienced trade surveillance professional could not foresee his duties expanding to include real time monitoring duties anytime soon:

"We look at patterns and exceptions after the event, not in real time. So that would be a fundamental change in the responsibility of a compliance function if that were to be a real time surveillance process as well. And therefore push back to the business to say you need to look at the impact in real time." (2021g)

The lack of fully-fledged real-time monitoring functionality did not pose a concern to the (generally) confident professionals interviewed for the study (2021e). Still, one did confess that is firm had:

"...deliberately slow[ed] down some algo[s] specifically, so they wouldn't be subject to some of the more onerous requirements..." (2021g).

#### (viii) Pre and post trade controls (Articles 15 and 17, RTS 6)

Article 15 makes the imposition of the following pre-trade controls mandatory upon order entry:

- price collars: to automatically block orders for prices outside specified parameters;
- maximum order values and volumes: to prevent the transmission of orders of uncharacteristically large size;
- order execution throttles: over the number of times an AT strategy has been applied. Once a
  pre-defined limit is reached the strategy is automatically disabled until re-established by a
  human after an examination; and
- market and credit risk limits.

Article 17 dictates that investment firms continuously operate post trade controls. Central to this requirement is the monitoring of credit risk and market risk. Again, both traders and risk managers are expected to operate post trade controls simultaneously, with appropriate action being taken in the

event one of the controls is triggered. For example, this could include recalibrating or withdrawing the algorithm in question.

The requirements of Article 15 and 17 drew little comment from participants. There are a range of potential explanations for this. First, monitoring levels of credit and market risk is well established in the investment sector, with one participate stating hyperbolically that professionals have been considering these "for thousands of years" (2021k). Second, this could indicate that price collars, throttles and maximum order values are set so generously that they have caused little friction. Third, AT has fallen down the regulator's list of priorities, causing firms to "set and forget" trading parameters. A regulator that had recently left the FCA at the time of being interviewed supposed:

"There will be some sort of flash crash or some sort of issue involving an algorithm, and that will prompt the regulator to suddenly start working in this space again. But I doubt it will do anything." (2021b)

A senior sales and trading professional did opine that pre trade controls are too focused on latency to the potential detriment of other risk factors:

"....everything is about messages per second, everything is about your what happens in price movements....that doesn't necessarily tell you ...what.. the underlying aim of the strategy [is]" (2021q).

#### 5. Discussion

The implementation of RTS 6 formalised the position of sell side investment firms as "gatekeepers" in the conduct of AT on EU and UK trading venues (Čuk and Van Waeyenberge, 2018). Concerns in the literature about the potential impact of resultant costs on firms' implementation are supported by the findings of this study (Čuk and Van Waeyenberge, 2018). Anxieties about market data charges and the availability of specialist headcount may encourage firms to "cut corners" in their AT control programmes. As forecasted by Conac (2017), some may even exit the market completely:

"Excessive regulatory obligations...is that going to drive people away from this type of business? I think there is a possibility that shareholders...are going to feel, you know what? The returns are not really worth the risk. [sic]" (2021j)

# (i) Policy proposal one: introduce mandatory AT qualification requirements for key staff

Echoing the concerns expressed in Sadaf et al. (2021) and Coombs (2016), there are indicators that the desire to control expenditure is encouraging firms to over rely on trade platform vendors to calibrate AT related parameters and perform testing. This "de facto" outsourcing appears set to continue in the near term, although professionals with advanced coding skills are gradually starting to enter the ranks of firms' control functions because of natural demographic change. Building upon SMCR, regulators could seek to accelerate the pace of this change by mandating that key staff in AT deployment possess mandatory AT related qualifications. The University of Oxford has already launched an AT short course aimed at professionals (2023e). Were the FCA to mandate training, other professional course providers would surely enter the market.

Introducing mandatory training would also help to alleviate the inherent operational resilience risks posed by firms relying on their vendors (2020b). Furthermore, mandatory training would reduce the risks posed by international groups. The Threshold Conditions require that the "mind and management" of an FCA regulated investment firm is based in the UK (2022h). Despite this, in international groups key decisions are liable to being made by staff based overseas who have limited knowledge of the UK regulatory system.

#### (ii) Policy proposal two: lessen the requirements in RTS6 for automated executors

Faced with skills shortages and cost pressures, firms may be tempted to take a "tick box" approach to fulfilling the requirements in RTS 6 if they are not perceived to be useful. The "creative interpretation" that has hitherto characterised the implementation of AT related initiatives is at risk of giving way to fatigue. Some aspects of the RTS 6 regime, such as the conduct of annual assessments and compilation of algorithm inventories, are not considered particularly burdensome. Nevertheless, they could reduce AT compliance to a preoccupation with process especially where firms face competing priorities. Regulators could build upon the *Wholesale Markets Review* to examine where some of the requirements in RTS 6 could be lessened, especially for firms that do not support the deployment of trading or machine learning algorithms. This would be conducive to a more outcomes focused approach to compliance.

#### (iii) Policy proposal three: introduce a Recognised Software Vendor ("RSV") regime

An alternative, or supplement, to refining the mandatory requirements on AT firms enshrined in RTS 6 would be to accept that reliance on third party vendors is inevitable and perhaps even desirable. In doing so, policymakers could expand the notion of "critical third parties" ("CTPs") in the context of AT to capture a broader array of technological infrastructure providers. Currently, UK regulators forecast that:from:

"...certain third parties providing data and artificial intelligence ("AI") or machine learning ("ML") models could emerge as future potential CTPs as a result of the increasing use of these data and models in trading systems, which could in turn lead to herding or procyclical behaviours" (2022b)

to capture a broader array of technological infrastructure providers.—The mitigation of systemic risk posed by CTPs is a core aim of the UK Financial Services and Markets Bill which, at the time of writing, is currently progressing through Parliament. Yet, expanding the concept of Coined "TechReg" by (Apfelbacher and Jasmina, 2019) by, regulating vendors directly could offer additional benefits.—in addition to just mitigating systemic risk, a core aim of the UK Financial Services and Markets Bill which, at the time of writing, is currently progressing through Parliament. After all, dData hungry Al models are likely to be out of reach for most sell side brokerage firms for the foreseeable future owing to the same cost and expertise constraints that drive to rely on their vendors. Besides, those firms that do have the financial and technical firepower necessary to develop the types of Al based AT operations described by the likes of Azzutti et al. (2021) are anticipated to significantly shrink their staffing levels as a consequence (Kelly, 2021). For these reasons it is recommended that UK policymakers consider expanding Part XVIII of the Financial Services and Markets Act 2000 ("FSMA") to include a new type of recognised body: the Recognised Software Vendor ("RSV").

Currently, Part XVIII makes provision for the recognition of the following types of market infrastructure providers:

Recognised Investment Exchanges ("RIEs"), for example the London Stock Exchange;

- Recognised Clearing Houses ("RCHs"), for example LME Clear Limited; and
- Recognised Central Securities Depositories ("CSDs"), for example Euroclear UK and International Limited.

By obtaining recognition, an RIE, RCH or CSD is exempt from having to obtain permission from either the FCA or Prudential Regulation Authority ("PRA") to conduct regulated activities in the UK (2022e). Nonetheless, to become recognised, an aspiring RIE, RCH or CSD must be able to demonstrate that it meets exacting governance, financial resource, and system and control requirements as set out in the Financial Services and Markets Act 2000 (Recognition Requirements for Investment Exchanges and Clearing Houses) Regulations 2001 (SI 2001/995). For example, in the context of AT, rule 2.5 of the FCA's RIE Sourcebook ("REC") (2022g) implements RTS 7 by requiring RIEs to:

- take measures to ensure AT systems deployed by market participants do not create or contribute to disorderly trading conditions;
- ensure their trading systems are resilient to cope with high message volumes and market stress; and
- ensure orders generated by AT are flagged for ease of identification.

Adopting parts of the Part XVIII FSMA 2000 and RTS 6 frameworks, conditions for becoming, and remaining, a RSV could include:

- stress testing algorithms that a RSV has incorporated into its trading platform software:
   using aggregated historic market data crowdsourced from all its investment firm clients, an
   RSV could perhaps achieve more meaningful testing than if those firms were acting by
   themselves;
- organising coordinated "market-wide" kill functionality simulations with investment firm clients based on this data;
- procuring periodic external assurance reviews and technical certifications as a "single source", reducing the scope for duplication and "performative" compliance by investment firms that lack the know-how to do this effectively;

- the "single source" maintenance of trading algorithm inventories: again, moving this to an RSV from individual investment firms would help reduce duplication. This would enable a regulator to focus its own limited resources on scrutinising fewer, higher quality, inventories as part of a periodic RSV audit programme; and
- being included in the proposed extension of SMCR to other market infrastructure providers (2023c): like RIEs, RSVs would be freed from the incentive structures that are often accused of encouraging investment firms and their staff to take excessive risks. This, together with an extension of SMCR's accountability requirements to RSVs, would ensure that technology companies have "skin in the regulatory game". This should help motivate staff employed by RSVs to use their expertise responsibly.

Whilst the introduction of a RSV regime should complement a more proportionate application of RTS 6, it is acknowledged that complete reliance on third party vendors would not be suitable for all firms engaged in AT. This would particularly be the case for automated traders deploying proprietary algorithms. If an RTS regime were implemented regulators should have additional capacity to focus on business models that pose the highest risks. It is also acknowledged that UK trading venues require trading platforms developed by non-member, third party, software vendors be tested for conformance to their requirements prior to live deployment (or following a material change). However, such conformance testing is relatively limited in scope (Azzutti, 2023), even if some participants felt that it is very prescriptive. For an example, see: LMEselect and LMEsmart Testing Services (2020a).

An obvious drawback of introducing an RSV regime is that it would result in increased costs for software vendors. Compliance and risk management personnel would need to be recruited to implement the requirements of the new regime. Existing software may also need to be adapted, although major changes would probably not be necessary. This is because an RSV regime would enhance the operation of RTS 6 rather than replace it. For example, investment firms would still monitor their own trading activity for compliance with the UK MAR. In addition, investment firms would work with vendors to test algorithms. Idiosyncrasies in a firm's specific operating environment or demands for a custom built algorithm would necessitate the supply of firm-specific simulated trade data. Even so, vendors would probably pass any additional costs on to firms using their platforms.

To limit the burden on firms and RSVs involved in the deployment of AI trading applications, the regulatory treatment for more deterministic (and controllable) systems could be lessened. Conversely, ML-based trading raises a number of additional uncertainties that require greater regulatory scrutiny. For example, an RSV might coordinate market-wide kill functionality simulations for ML based algorithms more frequently than would be the case than for deterministic algorithms.

#### (iii) Limitation and opportunity for further research

Finally, the lack of comment on the effectiveness of some pre-and post-trade controls required by RTS 6 represents a limitation of this study's findings. This could indicate that these requirements are not controversial. Firms may have implemented such controls prior to the promulgation of RTS 6. Alternatively, parameters may have been set so generously that they cause little noticeable friction in daily operations. One can only speculate. Therefore, an opportunity exists for future researchers to probe this further.

#### 6. Conclusion

Some might argue that the lack of a notable AT related events during the extremely volatile periods spurred by COVID-19 and Russo-Ukrainian War is testament to the effectiveness of firms' implementation of RTS 6. Others may ascribe the lack of incident to luck, particularly given that, to date, no major AT related events have reportedly occurred outside the UK or the EU either. The evidence presented in this article offers some support to both perspectives.

On the one hand, the professionals interviewed for this article demonstrated a good understanding of the requirements in RTS 6. They ascribed value to them. On the other hand, this does not necessarily translate into effective controls. Practitioners should pay particular attention to: (1) a lack of knowledge of the algorithms, code and strategies that are the subject of RTS 6; (2) regulatory fatigue; (3) a temptation to cut corners in an era of rising costs and squeezed returns; (4) overreliance on platform vendors; (5) governance in international groups; (6) the deliberate calibration of risk parameters to reduce friction; and (7) complacency arising from a lack of incident. In a follow up to the Wholesale Markets Review, policymakers could consider targeted refinements to the existing rules and the introduction of a RSV regime to reduce process and focus oversight on riskier AT models. As well as increasing firms' focus on outcomes, such a move could persuade firms with tighter budgets to stay

in the market. A loss of smaller investment firms would result in increases in concentration and liquidity risk, and in turn amplify the risk posed by poor conduct.

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## Appendix: Interview protocol

PART A	BACKGROUND	Investment firm sector/sub-sector
		Investment firm's goals
		Types of algorithms deployed
		Types of strategies employed
		Any machine learning / artificial
		intelligence algorithms?
	9	Design, deployment, (re) calibration
		process
		Understanding of conduct risk, firm's
	9/	internal framework
PART B	EMERGING CONDUCT RISKS	Firm's perception of conduct risks
	AND THEIR IMPLICATIONS FOR	associated with algorithmic trading in
	HUMAN ACCOUNTABILITY	sector/sub-sector, current and future
		Likely levels of self-calibration: near,
		medium and long term
		Knowledge/levels of understanding of
		algorithms and conduct risk: senior
		management, front office, support staff.
		Improving or declining?
		How do humans in firm stay abreast of
		algorithmic developments and behaviour?
		Description of conduct risk incidents
		involving algorithms – past 3 years
		Plans to reduce overhead because of
		increased automation of trading? Which
		areas?
PART C	MACHINE-TO-MACHINE	Approach to machine conduct mitigation
	REGULATION	Preventative: any embedded ethical /
		conduct standards?

Detective: Surveillance tools currently used?  Ability of humans to spot conduct events caused by algorithmic activity  Ability of regulators and markets to identify issues  Horizon developments, 'build, partner, buy'  Incentivising machines  Deterring machines  Punishing machines  Punishing machines  Industry / sector wide initiatives, collaboration levels  Involvement / reliance on third party vendors  Merits of legislative versus industry lead solutions  Likely effectiveness of UK's approach versus approaches of competitor jurisdictions, e.g. US, EU/EEA  Lessons learned:  incidents within trading industry  incidents extraneous to trading industry  Principle concerns for the future			
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Principle concerns for the future			

# Reponses to reviewers – round two 13/05/23

Recommendation	Posnonso
	Response  Note added per recommendation
"p. 3 - In internal auditing practices, the phrase	Note added per recommendation.
"first line of defence" generally refers to the	
people responsible at the front line of business	
practices, in this case the "human operators".	
Consider whether it is appropriate to include at	
least a note to clarify the distinction between	
this definition and the one provided in Azzutti,	
2023."	
"p. 5 - In the list of references "(Karremans and	Amended per the recommendation.
Schoeller, 2021, Seyfert, 2021, Lenglet and Mol,	
2016),": the different works should be	
separated by a SEMICOLON (;)."	
"P . 6 -There is a published version of the work	I have substituted the citation per the
cited Azzutti et al. (2022).	recommendation.
The author may wish to update the reference	
throughout the article. See:	
Azzutti, A., W.G. Ringe & H.S. Stiehl,	
'Regulating AI Trading from an AI Life Cycle	
Perspective.' In: N. Remolina and A. Gurrea-	
Martinez (eds.), Artificial Intelligence in Finance:	
Challenges, Opportunities and Regulatory	
Developments (Edward Elgar 2023) 198-242."	
p.7 -"it would be very difficult for firms to	"To" added to the sentence in question.
observe the principle of accountability which is	
so fundamental RTS 6."	
There seems to be a preposition missing	<b>6</b>
between "fundamental" and "RTS 6."	
"p. 8 -Is there a specific reason why the author	Added per the recommendation of the second
uses the Dutch regulator's taxonomy of	reviewer. I have added a note here to explain
algorithmic traders? Is it really relevant and	the rationale. The Netherlands is often reported
useful to support the clarity of the paper to	to be the UK's main rival as an destination for
have it here?"	algorithmic traders post Brexit. Accordingly,
	each jurisdiction's initiatives are likely to very
	influential on the other.
"p. 23-26 -The author presents an interesting	Per the suggestion, I have added an additional
policy proposal. To my knowledge, this is the	paragraph at the end of the relevant section
first paper to develop a specific idea on	which seeks to address these points.
regulation of third-party providers, although it	
is not the first to argue for proportional	
requirements for algorithmic trading based on	
different levels of risk.	
However, this section could be further	
developed to include a discussion of the "cons"	
inherent in such a proposal. And how the	
proposal would interact with existing regulatory	
requirements for trading venues (e.g., regarding	
compliance testing and oversight of trading	
activity). While	•
acknowledging that the author is doing his best	
and the dather is doing in best	I

to adhere to the journal's word limits, one-two	
sentences here would suffice."  p. 23 – "The section on "Policy Proposal Two"	I have incorporated the suggested wording at
could conclude by highlighting the difference in	the end of the relevant section and added an
regulatory treatment that different AI trading applications may entail. For example, while the	example to show how this might work in practice.
regulatory treatment for more deterministic	
(and controllable) systems may be lessened, ML-based trading raises a number of additional	
uncertainties that require greater regulatory	
p. 23 – "to capture a broader array of	I see the issue. I have reworked the sentence.
technological infrastructure providers. Coined "TechReg" by Apfelbacher and Jasmina (2019),	
regulating vendors directly could offer benefits	
in addition to just mitigating systemic risk, a core aim of the UK Financial Services and	
Markets Bill which, at the time of writing, is currently progressing through Parliament."	
There are some problems in the structure of	
this sentence. The author needs to revise it."	