

#### ORIGINAL RESEARCH

## Assessment of Glycemic Control Protocol (STAR) Through Compliance Analysis Amongst Malaysian **ICU** Patients

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Purpose: This paper presents an assessment of an automated and personalized stochastic targeted (STAR) glycemic control protocol compliance in Malaysian intensive care unit (ICU) patients to ensure an optimized usage.

Patients and Methods: STAR proposes 1-3 hours treatment based on individual insulin sensitivity variation and history of blood glucose, insulin, and nutrition. A total of 136 patients recorded data from STAR pilot trial in Malaysia (2017-quarter of 2019\*) were used in the study to identify the gap between chosen administered insulin and nutrition intervention as recommended by STAR, and the real intervention performed.

Results: The results show the percentage of insulin compliance increased from 2017 to first quarter of 2019\* and fluctuated in feed administrations. Overall compliance amounted to 98.8% and 97.7% for administered insulin and feed, respectively. There was higher average of 17 blood glucose measurements per day than in other centres that have been using STAR, but longer intervals were selected when recommended. Control safety and performance were similar for all periods showing no obvious correlation to compliance.

Conclusion: The results indicate that STAR, an automated model-based protocol is positively accepted among the Malaysian ICU clinicians to automate glycemic control and the usage can be extended to other hospitals already. Performance could be improved with several propositions.

Keywords: compliance, glycemic control, diabetes, stochastic targeted prediction, modelbased control

#### Introduction

Intensive care unit (ICU) patients are predisposed to stress hyperglycemia due to insulin resistance arising from the initial insult. 1-3 It is associated with increased risks of multiple organ failures, sepsis, and mortality. 4-7 Glycemic control (GC) has been used to reduce hyperglycemia and mortality.<sup>8-11</sup> However, other studies were unable to produce the same results. 12,13 Only one study reduced both mortality and hypoglycemia, 11 where increased hypoglycemic risk was an independent risk factor for increased mortality. 14,15

Glycemic control in the ICU becomes more challenging when there is a transition of conventional therapy using manual insulin treatment towards automated personalized treatments. For example, a "one size fits all method" or ad-hoc insulin therapy normally used as GC guidelines for fast clinical decision but the GC treatment may not necessarily effective, productive or cost-saving. 16,17 As each

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patient is different, the clinical treatment needed could be different, and patient's safety is also counted for GC primary consideration. Whereas manual insulin therapy or ad-hoc protocols used in the ICU patients need to rely on "one size fits all method" for clinical judgement rather than patient-specific variability. Thus, if more advanced technologies treatment is used for an effective GC, all of the challenges rise need to be countered.

Recent studies have shown safe, effective control for almost all patients is critical to improve outcomes, <sup>19–21</sup> validating other analyses showing time in band is associated with survival. <sup>22–26</sup> For better, more personalised control, fixed insulin protocols have been replaced by automated patient-specific model-based glycemic control. <sup>17,27-32</sup> The stochastic targeted (STAR), in particular, is focused on using patient-specific time-varying insulin sensitivity <sup>33</sup> to provide safe, effective control to essentially all patients with reduced workload and increased nutrition delivery. <sup>34–37</sup>

STAR uses a well-validated physiological model<sup>38</sup> and a user-friendly interface designed for accuracy<sup>39,40</sup> to dose insulin based on risk of future changes in insulin sensitivity (S<sub>I</sub>),<sup>41,42</sup> an approach proven to generalise across adult<sup>37,43</sup> and neonatal ICUs,<sup>44–46</sup> as well as with other technologies.<sup>47,48</sup> This protocol was adopted in Malaysia<sup>29</sup> after successful studies internationally.<sup>27,31,37,49</sup> Initial assessment of the first Malaysian pilot trial showed the control was safe. However, the percentage of blood glucose (BG) within the Malaysian target band of 6.0–10.0 mmol/L (108–180 mg/dL) was 60.7%, which is much lower than expected<sup>50</sup> and lower than in other studies with lower target bands and equal safety in other countries.<sup>37</sup>

Despite very positive feedback from clinicians through a survey conducted at the International Islamic University Malaysia Medical Centre (IIUMMC) using the protocol,<sup>51</sup> this paper presents a compliance analysis to identify the level of clinician adherence to STAR protocol recommendations. The assessment covers three years of patient data using STAR, covering compliance to insulin and nutrition recommendations.

#### **Methods**

Retrospective data from 170 IIUMMC patients (equivalent to 349 episodes of glycemic control) in the general ICU from 2017 to 2019\* were retrieved from the STAR cloud database. The data in 2019\* were used until the first quarter of 2019. Collected patients' data have received IIUMMC consent under ethics IREC 657 and Malaysian National Institute of Health

(NIH). Patient diagnosis was unavailable for now in this study due to incomplete overall data.

A patient can have multiple episodes of STAR GC if control was stopped and then restarted, which happens when patients meet stopping criteria but re-develop hyperglycemia, or when patients leave the ICU for surgery or imaging, to name a few possibilities. From 349 episodes, 78 episodes were excluded because there were only 1-2 BG points and were too short for assessment. As a result, there were 136 patients (271 episodes) with 12,153 total hours of data analysed. A total of 67 (49.2%) and 69 (50.8%) were male and female patients. Table 1 shows the median and interquartile range of patient's age, height, and length of glycemic control (LGC), separated into the 3 years analysed. The number of patients were the lowest in 2019\* as data were up only until April. Analysis of Variance (ANOVA) comparison scores on age (P=0.58), weight (P=0.62), LGC (P=0.97), and Acute Physiological and Chronic Health (APACHE) (P=0.87) II score show no significant difference between the three years data.

Table I Patient's Demographic

Demographic Parameter	Statistics			
Years of Data	2017	2018	2019*	
Total patients (Total patients with only 1 episode)	136 (66)			
Total episodes	271			
Per-cohort episodes (Total patients)	100 (37)	135 (76)	36 (23)	
Age (years old) [Median (Interquartile Range)]	62 [57–66]	63 [54–72]	63 [59–71]	
Weight (kilograms) [Median (Interquartile Range)]	64 [55–71]	61 [53–72]	65 [58–74]	
Total number of patients by gender (Female:Male)	18:19	34:42	17:6	
Overall LGC (hours) [Median (Interquartile Range)]	28 [14–57]			
Per-cohort LGC (hours) [Median (Interquartile Range)]	25 [11–52]	28 [14–56]	38 [19–71]	
Acute Physiological and Chronic Health (APACHE) II [Median (Interquartile Range)]	16 [11–23]	15 [11–20]	Not available	

 $\textbf{Note:}\ ^*\text{Indicates}$  that the available data used were until April, a quarter of 2019 unlike in the year of 2017 and 2018.

## STAR Protocol in Malaysia

STAR is implemented in tablets that record all historical data, from all measurements, recommendations, to all chosen treatments performed. It was launched in a newly operated university hospital IIUMMC in mid-January 2017 with three tablets. At IIUMMC, the BG control target range was 6.0–10.0 mmol/L (108–180 mg/dL) instead of a tighter and lower BG target of 4.4–8.0 mmol/L (79–144 mg/dL) used elsewhere. It provides 1-hour, 2-hour, or 3-hour treatment option recommendations for both insulin and nutrition delivery, modulating both inputs for control.

The STAR protocol implementation framework in Malaysia includes:

STAR starts when BG measurements were more than 10.0 mmol/L (180 mg/dL) for two consecutive hours.

STAR stops when BG measurements were stable for five to six hours defined as not receiving more than 2 U insulin for three consecutive BG measurement intervals below 10.0 mmol/L.

The default insulin band given in STAR was 0.0–8.0 U/hr with allowable increments of +0.5 U to +2 U. IIUMMC can manually modify the proposed insulin with highest insulin given capped at 10 U/hr. Modifications are recorded in STAR. Nutrition was provided with a non-protein goal of 20–25 kcal/g/day and protein supplied to be at least 1.2–1.5 g/kg/day.<sup>52</sup> Differences in nutrition given from the selected recommendation are recorded in STAR by attending clinical staff.

## Compliance Assessment

STAR provides up to three different recommendations from which to choose the next interval's insulin and nutrition input. Any modification made by clinicians were recorded in STAR. Compliance is assessed to identify clinical adherence to the model-based protocol recommendations. In this case, compliance is assessed by the number of time clinician's follow the dose/amount of the chosen recommendation, quantified:

$$Compliance = \frac{Nb. of complied interventions}{Total Nb. of interventions}$$
 (1)

Compliance was assessed for each year (2017, 2018, 2019\*). ANOVA test was assessed between the compliance and non-compliance interventions in three different years where p-value less than 0.05 suggests the statistical difference. Per-patient compliance is illustrated through a single CDF graph each, to study the level or magnitude of

non-compliance and its trends. Compliance needs to be assessed and audited from time to time since compliance may impact GC performances. And Moreover, given STAR is a clinical practice change, shifting from a sliding-scale to a model-based protocol, it is interesting to see whether the level of trust increases over the years. The magnitude and extent of non-compliance can also provide insight into the reasons for specific clinical choices and/or the lack of trust in new protocol. Sa

## Associated Performances and Safety

Performance and safety assess control quality by year and thus if compliance influences patient control performance outcomes. Cumulative distribution frequency plots (CDF) of BG for three years and overall are plotted where glycemic variabilities for per-patient can be referred. Median, interquartile range, and ANOVA test were assessed between the three different years to show the performance and safety results statistical difference. Specific metrics assessed include:

- Performance: Percentage of time in targeted bands (TIB); 4.4–8.0 mmol/L (79–144 mg/dL) and 6.0–10.0 mmol/L (108–180 mg/dL). The first target band was chosen based on default and proposed STAR target band.<sup>22–26</sup> The second was the band used in IIUMMC based on the standard Malaysian ICU protocol.<sup>52</sup> Clinical trial BG, insulin, and feed were also assessed.
- Safety: Percentage of BG>10.0 mmol/L (180 mg/dL) (hyperglycemia), BG<4.4 mmol/L (79 mg/dL), BG<4.0 mmol/L (72 mg/dL) (mild hypoglycemia), and BG<2.2 mmol/L (39 mg/dL) (severe hypoglycemia).</li>

#### Results

Table 2 shows compliance assessment results for insulin and nutrition administration. Overall average compliance was 98.8% and 97.7% for insulin and nutrition, respectively. Administered insulin compliance increased by 2.5% from 97.2% in 2017 to 99.7% in 2018 and 2019\*. Compliance to nutrition recommendations was relatively constant but fluctuating with 98.6%, 96.7%, and 98.8% for the three years, respectively. Table 2 also shows the clinical trial's glycemic control and intervention results. The insulin and nutrition administered were similar across the three years. Relative to compliance, total insulin administered was lower than recommended, but far closer in 2019\* than in the first year, 2017. Workload, measured

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Table 2 Results of Compliance and Clinical Trials of IIUMMC Patients

Parameter	Overall	2017	2018	2019	P-value Test
Insulin compliance (%)	98.8	97.2	99.7	99.7	P<0.05
Nb. of times for insulin non-compliance	109	96	10	3	
Nb. episodes with insulin non-compliance	32	22	7	3	
Total amount of recommended insulin (U)	24097.8	9390.6	10903.7	3485	No significant
Total amount insulin given (U)	23533.0	9162.6	10878.8	3475.7	
Absolute amount of insulin non-compliance (U)	277.8	227.1	41.1	9.3	
Feed compliance (%)	97.7	98.6	96.7	98.8	P<0.05
Nb. of times for feed non-compliance	200	50	136	14	
Nb. episodes with feed non-compliance	66	22	39	5	
Total amount of recommended feed (mL)	282493.3	122342.0	128537.0	31614.3	No significant
Total amount feed given (mL)	281142.3	121880.0	127911.0	31351.3	
Absolute amount of feed non-compliance (mL)	6124.2	715	3755.1	303.0	
Clinical BG in median [IQR] (mmol/L)	8.7 [7.0–11.0]	8.8 [7.0–11.0]	8.6 [6.9–10.9]	8.8 [7.1–11.0]	<0.05
Clinical insulin in median [IQR] (U/hr)	1.5 [0.4–3.1]	1.6 [0.5–3.2]	1.5 [0.2–3.0]	1.5 [0.4–3.2]	<0.05
Clinical feed in median [IQR] (g/hr)	5.2 [3.7–6.9]	5.2 [3.8–6.3]	5.1 [2.4–7.1]	5.2 [4.3–6.1]	<0.05
Nb. of BG measurement	8777	3498	4070	1209	No significant
Average BG measurement per day	17	18	17	17	_
Hourly Resampled Measurements					
%BG within 4.4–8.0 mmol/L (79–144 mg/dL)	45.0 [26.3–62.5]	50.0 [29.7–68.7]	42.7 [23.2–58.8]	43.1 [29.3–61.8]	No significant
%BG within 6.0–10.0 mmol/L (108–180 mg/dL)	65.0 [50.0–78.4]	64.2 [51.1–77.7]	65.6 [47.2–78.4]	68.9 [50.6–77.6]	No significant
%BG >10.0 mmol/L (180 mg/dL)	19.0 [10.6–33.9]	16.9 [10.0–30.1]	20.0 [10.7–36.4]	21.4 [15.5–38.9]	No significant
%BG <4.4 mmol/L (79 mg/dL)	0.0 [0.0–1.4]	0.0 [0.0–3.7]	0.0 [0.0–0.9]	0.0 [0.0–0.0]	<0.05
%BG <4.0 mmol/L (72 mg/dL) mild hypoglycemia	0.830	1.313	0.530	0.574	<0.05
%BG <2.2 mmol/L (39 mg/dL)	0.0 [0.0–0.0]				No significant
Nb. episodes of mild hypoglycemia	93	38	45	10	_
Nb. episodes of severe hypoglycemia	2	1	1	0	-

Abbreviations: Nb, number; BG, blood glucose.

as number of BG measurements, averaged 17 per day across all three years, indicating nurses were selecting shorter treatment intervals than offered. The statistical test between compliance and non-compliance for insulin and feed interventions as shown in Table 2 is significantly different where all the p-values were less than 0.05.

In terms of the performance and safety, the median BG was a relatively constant 8.8 mmol/L to 8.6 mmol/L to 8.8 mmol/L, in all three years. Per-patient % BG between 4.4–8.0 mmol/L in 2017 and 6.0–10.0 mmol/L in 2019\* varied reflecting small shifts in control or patients, but variations were not large, where the p-value test showed in Table 2 are not statistically significant. Mild hypoglycemia fluctuated across years, but the overall hypoglycemia cases is lower than 1% which shows STAR personalized care improved hypo cases over the years. Hyperglycemia rate for %BG > 10.0 mmol/L was

relatively constant between 16–20% of measurements, and showed no significant different . Figure 1 shows all per-patient BG CDF plots and the median (dotted line), IQR of 25% to 75% (dark blue range), and 5% to 95% (light blue range) of per-patient responses for each year and overall, where 2017 and 2018 are qualitatively similar and 2019\* is narrower. Overall, performance was similar, and hypoglycemia cases decreased over years. Thus, compliance which was relatively high does not appear to affect GC results in this case.

Figure 2 shows example patient episodes for Patient 68 (Compliant patient) and Patient 8 (Non-compliant patient). Patient 68's compliance for administered insulin and nutrition was 100%, while Patient 8 was 73.6% (insulin) and 98.75% (nutrition), showing potential significant reluctance to use insulin for fear of hypoglycemia. Another example of patient 11 (referring to Figure 2C) shows compliance of insulin and

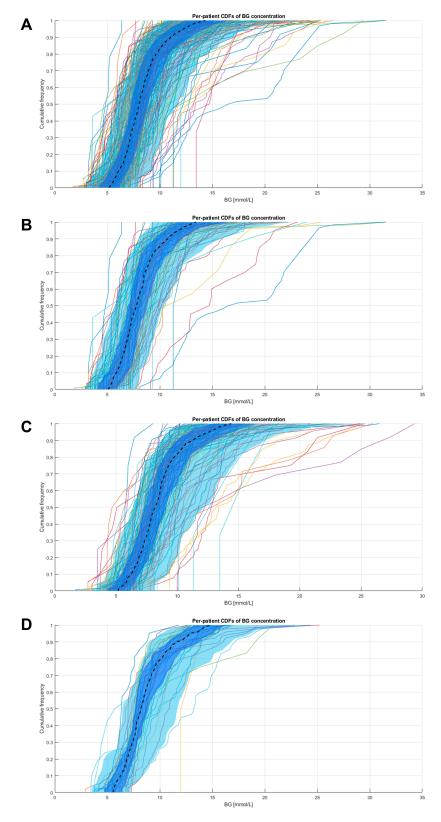


Figure 1 BG cumulative distribution frequency (CDF) for (A) Overall (B) 2017 (C) 2018 and (D) 2019\*.

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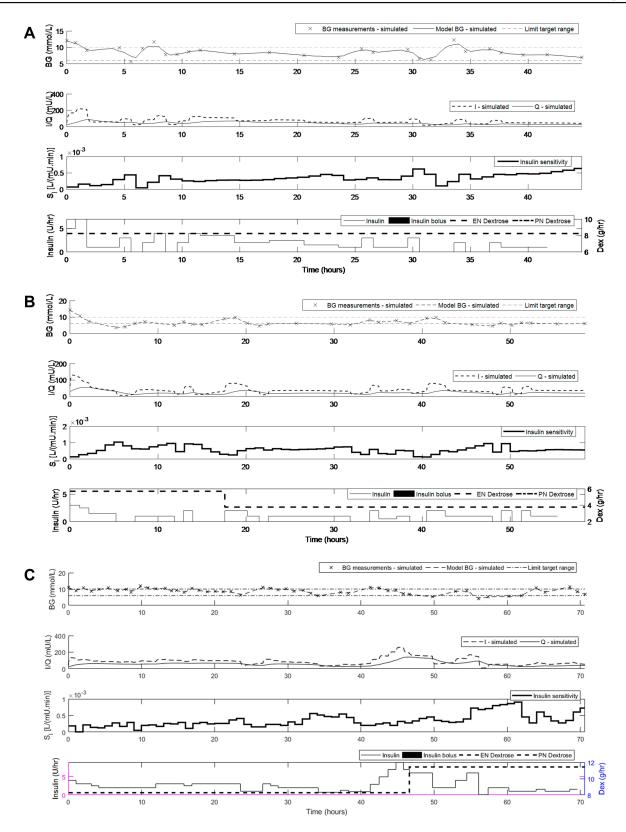


Figure 2 Profile figures of (A) compliant episode (patient 68), and (B) non-compliant episode (Patient 8) under STAR protocol. The first panel represents blood glucose (BG) mmol/L. The cross (x) is the BG clinical reading and the line is fitted BG using integral fitting method. The dashed line represents the BG limit target of 6–10.0 mmol/L (108–180 mg/dL). The second panel shows the plasma insulin (I) mU/L (dashed line) and interstitial insulin (Q) mU/L (straight line). The third panel is patient's insulin sensitivity and the last panel represents insulin administered and feed given, straight line for insulin (U/hr), dashed line for Enteral feed (g/hr), and dashed dotted line for Parenteral feed (g/hr).

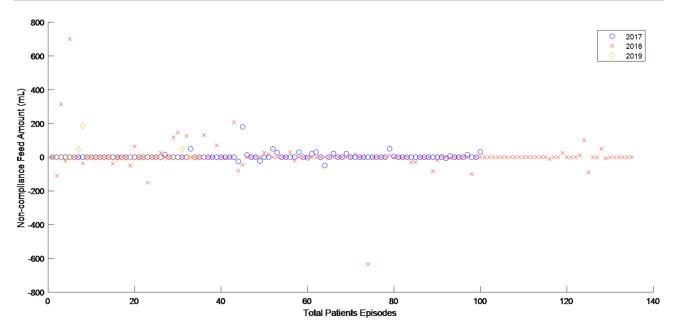


Figure 3 Non-compliance nutrition amount (mL) per episode for each year. It is clear non-compliance occurs primarily in 2017–18.

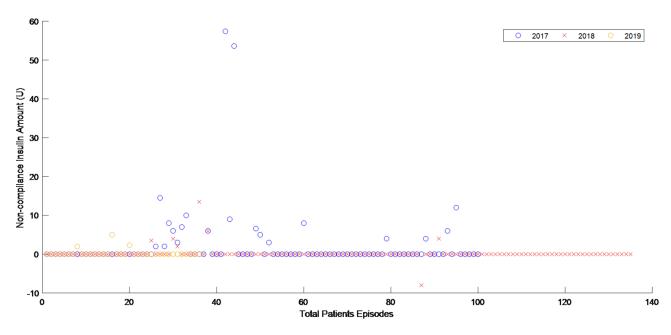


Figure 4 Non-compliance in total recommended insulin amount (U) per episode for each year. It is clear non-compliance occurs primarily in 2017.

nutrition was 39.2% and 98%. Patient 8 and 11 had lesser GC performance and higher BG values, indicating compliance percentage below 80% for insulin interventions did affect both patients, and those other patients with significant non-compliance were similar. The BG, insulin, and feed interventions between compliant and non-compliant showed in Table 2 are statistically different where the p-value was less than 0.05. However, the clinical difference is not evident in the overall cohort.

Figures 3 and 4 show the per-episode non-compliant amount of insulin and nutrition for each year. These figures illustrate the difference between selected recommendation and the real amount given, summed in total. Negative values mean the amount given was more than recommended. 2018 has the highest nutrition non-compliance amount (700.4 mL for Patient 5) and rate of occurrence. For insulin, 2017 is the most non-compliant year by rate of occurrence, and Patient 11 had the distinctive case

BG Treatment Recommended	Total BG Treatment Recommended	Number of Chosen/Available BG Treatment		
		I-Hour	2-Hours	3-Hours
Only Option   Recommended	277	277/277		
Only Options I and 2 Recommended	710	432/571	136/139	
Options 1, 2, and 3 Recommended	11919	5676/7930	818/2353	1395/1636
Total and Overall Percentage	12906	6385/8778	954/2492	1395/1636

Table 3 The Availability and Number of Times 1-, 2-, and 3-Hour Interval Interventions Chosen

with a difference of 57.4 U, noting a significant underdosing compared to recommended values and treatments selected. Notably, insulin non-compliance is all under-dosing (positive values) in Figure 4, where there is some spread in Figure 3 for nutrition administration.

Table 3 summarizes the availability and the number of times 1-hour, 2-hour, or 3-hour interval interventions were chosen, in three contexts, i) only option 1-hour available, ii) only option 1-hour and 2-hours available, and iii) All 3 options available.

#### **Discussion**

Overall, the results show good compliance where clinicians followed STAR recommendations even though it was a major change in practice. The comparison between the compliance and non-compliance interventions for both insulin (P=5.4 x 10<sup>-15</sup>) and nutrition (P=0) demonstrated statistical difference with p-values less than 0.05. In particular, compliance to dosing recommendations increased over the years. In addition, the level of non-compliance seen in the rate of occurrence per-patient and amount or magnitude of difference fell. Insulin compliance was more notable, and always an under-dosing compared to recommendation, reflecting a well-known fear of hypoglycemia. 53-55

In-contrast, non-compliance to nutrition recommendations was slightly more common, and in most cases represented increases to meet a certain standard. There is a need to scrutinize these episodes in particular to consolidate the ICU's nutrition guidelines and goals more clearly, <sup>56</sup> including correlation with glycemic control performance as STAR has been shown to be able to provide world-best nutrition delivery, in practice as well as in (fully compliant) virtual trials. <sup>35,36</sup> STAR control provides balance in insulin and nutrition automated clinical care treatment. In this study, the percentage of compliance interventions was high which demonstrated the acceptance of transition in automated technology and personalized treatment.

Workload was higher than other cases internationally with 17 measurements per day versus 12 per day in other centres.<sup>37</sup> The issue is that there were far fewer times where longer intervals were offered. They were highly selected when they were offered, as seen in Table 3. The issue is the short length of episodes compared to other centres and high initial BG values meaning there was a lower time in band, as noted in Table 2, and higher proportion of hyperglycemia (Table 2) than other centres.<sup>37</sup> These results ensure that there is a greater proportion of 1-hour only options available in control, where longer stay allows patients to be more stably controlled and thus longer options to be chosen. This issue might be better addressed by considering any of a lower target band, as per other centres,<sup>37</sup> a more difficult stopping criteria requiring BG under 8.0 mmol/L and low insulin dosing for stopping instead of BG < 10.0 mmol/L as now, and/or earlier commencement where initial high BG values make control workload harder as longer intervals are not available until BG is in the goal band. These considerations require further study and consultation with clinical staff, although clinically validated virtual trials show the potential. 34,43,50,57-62

Finally, except for improving compliance, specifically in insulin delivery, there was no clear pattern across the years. This result clearly shows the STAR protocol was taken up and that confidence in its insulin dosing rose over time with nursing and clinical staff. It also demonstrates the consistency in control quality seen in studies across other centres.<sup>37</sup> Both outcomes are positive for the protocol in general.

This study has at least 2 limitations. First, important details pertaining to patient demographics and diagnoses, such as morbidities and type of ICU admission are not available for now as we only have these data on the earliest 30 patients thus were not included for this study. As a result, a more in-depth study on possible root causes for non-compliance cannot be made, nor can non-compliance be associated with a particular patient type of diagnosis

group. In addition, as noted, results are influenced by the relatively short length of patient episode on GC. Instead of grouping data by years, a study with patients/episodes grouped by length of stay and length of glycemic control in the ICU might be more informative. Equally, a further study considering stopping criteria that administered insulin longer could reduce the effect of having multiple short episodes in lieu of a single longer episode per patient as is more common in other centres.<sup>37</sup>

#### **Conclusion**

The STAR protocol was well accepted at IIUMMC as a new model-based control protocol to replace a fixed insulin therapy approach. Compliance analysis showed high compliance to insulin and nutrition administration recommendations of over ~96%. These values were relatively constant over the three years considered, but increased for insulin showing increasing confidence in the protocol over time, although initial levels were very high. Control safety and performance were similar for all periods and overall were acceptable, showing no noticeable impact of compliance. Performance could be improved with a range of options from different target bands to changed stopping criteria that required more stable control performance before stopping glycemic control. STAR is expected to be used in other ICUs in Malaysia.

#### **Abbreviations**

GC, glycemic control; BG, blood glucose; STAR, stochastic targeted; ICU, intensive care unit; S<sub>1</sub>, insulin sensitivity; Nb, number; IQR, interquartile range; IIUMMC, International Islamic University Malaysia Medical Centre.

# Ethics Approval and Consent to Participate

All data used were approved under ethics collaboration with International Islamic University Malaysia (IIUM) Medical Centre. The ethics number is IREC 657. All patient's data have been de-identified and received consent for this study which is under IIUMMC data provision.

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#### **Disclosure**

The authors report no conflicts of interest in this work.

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