Development, implementation and outcomes of a quality assurance system for the provision of continuous renal replacement therapy in the intensive care unit

Eloy F. Ruiz1, Victor M. Ortiz-Soriano1, Monica Talbott1, Bryan A. Klein1, Melissa L. Thompson Bastin1, Kirby P. Mayer3, Emily B. Price3, Robert Dorfman1, Brandi N. Adams1, Lisa Fryman1, Javier A. Neyra1* on behalf of The University of Kentucky CRRT Quality Assurance Group

Critically ill patients with requirement of continuous renal replacement therapy (CRRT) represent a growing intensive care unit (ICU) population. Optimal CRRT delivery demands continuous communication between stakeholders, iterative adjustment of therapy, and quality assurance systems. This Quality Improvement (QI) study reports the development, implementation and outcomes of a quality assurance system to support the provision of CRRT in the ICU. This study was carried out at the University of Kentucky Medical Center between September 2016 and June 2019. We implemented a quality assurance system using a step-wise approach based on the (a) assembly of a multidisciplinary team, (b) standardization of the CRRT protocol, (c) creation of electronic CRRT flowsheets, (d) selection, monitoring and reporting of quality metrics of CRRT deliverables, and (e) enhancement of education. We examined 34-month data comprising 1185 adult patients on CRRT (~ 7420 patient-days of CRRT) and tracked selected QI outcomes/metrics of CRRT delivery. As a result of the QI interventions, we increased the number of multidisciplinary experts in the CRRT team and ensured a continuum of education to health care professionals. We maximized to 100% the use of continuous veno-venous hemodiafiltration and doubled the percentage of patients using regional citrate anticoagulation. The delivered CRRT effluent dose (~ 30 ml/kg/h) and the delivered/prescribed effluent dose ratio (~ 0.89) remained stable within the study period. The average filter life increased from 26 to 31 h (p = 0.020), reducing the mean utilization of filters per patient from 3.56 to 2.67 (p = 0.054) despite similar CRRT duration and mortality rates. The number of CRRT access alarms per treatment day was reduced by 43%. The improvement in filter utilization translated into ~ 20,000 USD gross savings in filter cost per 100-patient receiving CRRT. We satisfactorily developed and implemented a quality assurance system for the provision of CRRT in the ICU that enabled sustainable tracking of CRRT deliverables and reduced filter resource utilization at our institution.

Continuous renal replacement therapy (CRRT) is the most common modality of renal replacement therapy (RRT) utilized for managing critically ill patients with acute kidney injury (AKI) or end-stage kidney disease (ESKD) who are hemodynamically unstable and with significant electrolyte/acid–base abnormalities or volume overload1–3. Although only 6–10% of all patients in the intensive care unit (ICU) require acute RRT4–6, mortality in these patients is high (50–60%)3,4,7. Thus, this is a vulnerable ICU population with a continuous need for an organized approach to specialized care.

1Division of Nephrology, Bone and Mineral Metabolism, Department of Internal Medicine, University of Kentucky, Lexington, KY, USA. 2College of Pharmacy, Department of Pharmacy Practice and Science, University of Kentucky, Lexington, KY, USA. 3Department of Physical Therapy, University of Kentucky, Lexington, KY, USA. *A comprehensive list of consortium members appears at the end of the paper. *email: javier.neyra@uky.edu
Regardless of substantial development in the technology and delivery of CRRT to critically ill patients, for example, standardizing delivered average effluent flow rate to 20–25 ml/kg/h⁸, several aspects of CRRT delivery are not fully standardized or do not have solid evidence-based foundations⁹. Outstanding questions related to provision of CRRT remain unanswered: patient selection, timing of CRRT initiation and discontinuation, volume management, anticoagulation and the role of high-volume hemofiltration and hemoadsorption¹,³. These factors hinder standardized provision of CRRT and result in wide heterogeneity of practice and in some cases, suboptimal care for patients¹⁰,¹¹. Current research focuses on addressing these uncertainties, however, information about the delivery process and quality of CRRT is still scarce¹².

Optimal CRRT delivery demands continuous coordination and communication among multiple stakeholders, iterative assessment and adjustment of therapy, and quality assurance systems¹¹,¹³. A recent systematic review identified potential quality indicators for CRRT classified into three categories: structure, process and outcome¹⁰, which included having a specialized care team, estimating the delivered and prescribed CRRT dose, measuring the average filter life span, evaluating patient prognosis, among others²,¹⁰,¹³,¹⁴. The success of a CRRT quality assurance system depends on team work dynamics and the selection of adequate CRRT metrics which can be captured longitudinally and monitored systematically to identify problems and generate opportunities for sustainable process improvement¹³,¹⁵. In this quality improvement (QI) study, we report the development, implementation and outcomes of a quality assurance system to support the provision of CRRT to adult patients in the ICU.

## Results

### Patient characteristics.

We examined our 34-month experience comprising 1185 adult patients on CRRT (~ 7420 patient-days of CRRT). As shown in Table 1, overall demographic and clinical data before and after QI interventions were comparable. There were no differences in 12 out of 13 clinical characteristics reflecting demographics, AKI status or acuity of illness parameters (e.g. SOFA score). The Charlson Comorbidity Index (CCI) was slightly lower in patients examined after the QI interventions (4.0 vs. 5.0 before the QI interventions, p = 0.030).

### Quality improvement metrics.

Data related to the selected CRRT QI metrics before and after QI interventions are shown in Table 2. To better visualize the trajectory of these metrics after the QI interventions, the 18-month data following QI interventions were subdivided into three 6-month periods.

### Table 1. Patient characteristics before and after implementation of CRRT quality improvement interventions. Before QI interventions period included data from September 2016 to December 2017 (total of 16 months before and during QI interventions). After QI interventions period included data from January 2018 to June 2019 (18 months). AKI acute kidney injury, CCI Charlson comorbidity index, CRRT continuous renal replacement therapy, ESKD end-stage kidney disease, ICU intensive care unit, LOS length of stay, QI quality improvement, SOFA sequential organ failure assessment. *p*-value of comparison for data before and after QI interventions.

| Characteristics       | Total   | Before QI interventions | After QI interventions | p-value<sup>a</sup> |
|-----------------------|---------|-------------------------|------------------------|---------------------|
| Total patients, n (%) | 1185    | 483                     | 702                    | 0.212               |
| AKI                   | 986 (83.2) | 394 (81.6)             | 592 (84.3)             |                     |
| ESKD                  | 199 (16.8) | 89 (18.4)               | 110 (15.7)             |                     |
| Age (years), mean ± SD| 56.6 ± 14.2 | 55.9 ± 13.9             | 57.1 ± 14.4            | 0.147               |
| Sex, male, n (%)      | 712 (60.1) | 290 (60.0)              | 422 (60.1)             | 0.980               |
| Race                  | 1087 (91.7) | 441 (91.3)              | 646 (92.0)             | 0.254               |
| White                 | 1087 (91.7) | 441 (91.3)              | 646 (92.0)             |                      |
| Black                 | 91 (7.7)   | 41 (8.5)                | 50 (7.1)               |                      |
| Other                 | 7 (0.6)    | 1 (0.2)                 | 6 (0.9)                |                      |
| Weight (kg), median [IQR] | 90.9 [75.0–109.9] | 90.8 [71.0–110.0] | 91.0 [77.0–109.1] | 0.229               |
| Hospital LOS (days), median [IQR] | 14.6 [5.7–28.8] | 14.0 [6.0–27.9] | 15.1 [5.4–29.4] | 0.544               |
| ICU LOS (days), median [IQR] | 8.9 [3.8–19.2] | 8.6 [3.8–15.5] | 9.6 [3.9–20.7] | 0.072               |
| Mechanical ventilation (days), median [IQR] | 4.0 [1.0–8.0] | 3.5 [1.0–7.3] | 4.0 [1.0–8.0] | 0.278               |
| Total CRRT days, median [IQR] | 3.1 [1.4–7.0] | 3.0 [1.2–6.5] | 3.3 [1.6–7.4] | 0.086               |
| SOFA score at ICU admission, median [IQR] | 12.0 [9.0–14.0] | 12.0 [10.0–15.0] | 12.0 [9.0–14.0] | 0.198               |
| SOFA score at CRRT initiation, median [IQR] | 14.0 [11.0–16.0] | 13.0 [11.0–15.0] | 14.0 [11.0–16.0] | 0.476               |
| CCI score, median [IQR] | 4.0 [2.0–7.0] | 5.0 [3.0–7.0] | 4.0 [2.0–6.0] | 0.030               |
| Discharge disposition, n (%) |          |                        |                       | 0.167               |
| Alive                 | 507 (42.8) | 219 (45.3)              | 288 (41.0)             |                      |
| Dead                  | 678 (57.2) | 264 (54.7)              | 414 (59.0)             |                      |
Quality domain: structure. Regarding the provider subdomain, we increased our initial CRRT team from 1 clinician champion, 1 nurse educator and 77 CRRT Super Users (ratio of Super Users to total ICU nurses: 0.13) in 2017 to a specialized multidisciplinary CRRT team constituted by 4 clinician champions (2 nephrologists and 2 intensivists), 3 nurse educators, 1 CRRT QI officer, 130 CRRT Super Users (ratio of Super Users to total ICU nurses: 0.21), 2 dieticians, 2 physical therapists, 1 pharmacist, and 2 bioinformaticians (Supplementary Fig. S1).

Likewise, we provided instruction to our ICU nurses and clinicians to achieve a continuum of education and training as detailed in Table 3.

In relation to the prescription subdomain, we improved adherence to the use of continuous veno-venous hemodiafiltration (CVVHDF) from 92.4% to 100% (p < 0.001). The percentage of patients using regional citrate anticoagulation (RCA) also significantly increased from 23.1% (January–June 2018) to 39.5% (January–June 2019).

Table 2. Selected CRRT metrics before and after implementation of CRRT quality improvement interventions. The period before QI interventions included data from September 2016 to February 2017 (6 months). CRRT continuous renal replacement therapy, CVVHDF continuous veno-venous hemodiafiltration, RCA regional citrate anticoagulation, USD United States dollars. *p-value of comparison for data before QI interventions and from the last 6 months after QI interventions (Jan 2019–Jun 2019). If data before QI interventions were not available, data from the first 6 months after QI interventions (Jan 2018–Jun 2018) were used as reference.

| CRRT QI metrics | Before QI interventions | After QI interventions | p-value* |
|------------------|-------------------------|------------------------|----------|
| CRRT modality (CVVHDF), % | 92.4% | 95.1% | 96.6% | 100.0% | < 0.001 |
| Anticoagulation (RCA), % | No data | 23.1% | 24.7% | 39.5% | < 0.001 |
| Total RCA/RCA-CRRT hours, mean ± SD | No data | 0.62 ± 0.30 | 0.68 ± 0.27 | 0.73 ± 0.26 | 0.004 |
| Delivered effluent dose (ml/kg/h), mean ± SD | 30.50 ± 4.18 | 27.67 ± 2.07 | 28.17 ± 1.83 | 30.33 ± 3.14 | 0.939 |
| Delivered/prescribed effluent dose, mean ± SD | 0.88 ± 0.07 | 0.88 ± 0.02 | 0.88 ± 0.01 | 0.90 ± 0.02 | 0.487 |
| Filter life span (hours), mean ± SD | 26.00 ± 3.16 | 30.17 ± 4.96 | 31.00 ± 2.83 | 31.17 ± 3.31 | 0.020 |
| Filters per patient, mean ± SD | 3.56 ± 0.78 | 2.90 ± 0.87 | 2.75 ± 0.50 | 2.67 ± 0.64 | 0.054 |
| CRRT access alarms per treatment day, mean ± SD | 2.95 ± 1.02 | 2.02 ± 0.64 | 1.63 ± 0.20 | 1.68 ± 0.50 | 0.021 |
| Total filter cost per 100-patient (USD) ± SD | 80,010 ± 17,519 | 65,173 ± 19,614 | 61,744 ± 11,287 | 59,876 ± 14,292 | 0.054 |

Table 3. Summary of the three CRRT quality improvement intervention phases. CRRT continuous renal replacement therapy, CVVHDF continuous veno-venous hemodiafiltration, EHR electronic health records, ICU intensive care unit, QI quality improvement, RCA regional citrate anticoagulation.
2019) \((p < 0.001)\); and from those patients, the average ratio of the hours a patient had RCA by the total hours the same patient was on CRRT also increased from 0.62 to 0.73 \((p = 0.004)\). There were no data pertaining to the period before QI interventions for these two RCA-related QI metrics (Table 2). It is important to note that in our program we commonly use RCA vs. no anticoagulation for CRRT, and we seldom use systemic heparin unless the patient has other specific indications for systemic anticoagulation (e.g., venous thromboembolism).

**Quality domain: process.** When assessing the performance subdomain, the delivered CRRT effluent dose \((\text{ml/kg/h})\) remained stable \((30.50 \text{ vs. } 30.33; p = 0.939)\) as well as the ratio of delivered/prescribed CRRT effluent dose \((0.88 \text{ vs. } 0.90; p = 0.487)\) (Table 2). The average filter life increased from 26 to 31 h \((p = 0.020)\), reducing the mean utilization of filters per patient from 3.56 to 2.67 \((p = 0.054)\) (Fig. 1 and Table 2) despite similar CRRT duration \((\text{median } 3.0 \text{ vs. } 3.2, p = 0.194)\) and mortality rates \((54.7\% \text{ vs. } 56.7\%, p = 0.612)\) when comparing the periods before QI interventions and the last 6 months post-intervention (January–June 2019). Also, the number of access alarms per treatment day was reduced by 43\% \((p = 0.021)\) (Fig. 1, Table 2).

**Economic savings.** The improvement in filter utilization translated into \(\sim 20,000\) USD gross savings in filter cost per 100-patient receiving CRRT \((p = 0.054)\) (Table 2, Fig. 2).
Discussion

Critically ill patients requiring CRRT should receive their treatment in a safe, consistent and high-quality manner. Previous QI studies in the CRRT population have focused on the formation of a specialized CRRT team and the creation of educational programs to improve the provision of CRRT in the ICU. Others have conducted interventions to optimize specific CRRT deliverables such as the delivered effluent dose, the achievement of daily fluid removal goals, as well as increasing filter life or decreasing unplanned filter changes and total CRRT downtime. Our group has also reported QI interventions for patients on CRRT such as early rehabilitation and physical activity and the management of severe hyponatremia with customized solutions. In this manuscript, we report the development, implementation and outcomes of a quality assurance system to support the provision of CRRT in the ICU at our institution. It is important to highlight that patient demographics and clinical parameters before and after the QI interventions were comparable with the only exception of the CCI score. Further, preconditions such as type of CRRT machine (Prismaflex), filter (HF1400) and catheter (Trialysis) remained unchanged throughout the study period, allowing the comparison of the selected CRRT metrics before and after QI interventions. Our report adheres to the Standards for Quality Improvement Reporting Excellence (SQUIRE 2.0) guidelines and recommendations.

The QI intervention lasted 10 months and was carried out in a step-wise fashion. Several key elements to its successful implementation should be noted. First, the robust multidisciplinary collaboration between nephrologists, intensivists, ICU nurses, pharmacists and other healthcare professionals provided unique perspectives, expertise, and helped to achieve a common mindset for the provision of CRRT in the ICU. Second, the standardization of the CRRT protocol on the use of CVVHDF and RCA helped to reduce variability of CRRT delivery and maximize the providers’ competence as education was focused on a specific order set. Additionally, well-defined catheter characteristics and CRRT vascular access site helped to acquire dexterity on its handling and functionality. Third, the creation of the electronic CRRT flowsheets allowed for automated machine data transfer and embedded calculations supporting data entry for ICU nurses. Furthermore, as this tool is available on-line within the electronic health record (EHR), the clinical and QI teams were able to track CRRT delivery at any given moment. Fourth, the selection, monitoring and reporting of specific CRRT QI metrics facilitated the assessment of interim results, identification of areas for improvement, and modifications or reinforcement of good practices for better outcomes. Lastly, the establishment of a dedicated CRRT education team made it possible to continuously train and improve the workforce’s knowledge and skills. Of note, some QI metrics exhibited an early trend of continuous improvement while others only showed a significant improvement by the last 6 months post-implementation (e.g., use of RCA anticoagulation). The latter reflects real-world hindrances in CRRT delivery, which require a sustainable process of QI monitoring, continuous education, and tailored interventions to achieve the desired QI goals.

By the end of June 2019, we increased the number of multidisciplinary experts comprising the CRRT QI team and ensured a continuum of education to healthcare professionals involved in CRRT delivery. This was a major milestone because every CRRT program requires a diverse, strong and engaged core responsible for the provision of high-quality and cost-effective CRRT. Some institutions have described weak collaboration between stakeholders (e.g., nephrologists and intensivists), not enough training for their healthcare professionals or lack of CRRT QI initiatives. Fortunately, we were able to develop a specialized CRRT team in addition to dedicated classes for ICU nurses and clinicians held many times per year (Table 3), plus approachable educators to solve questions and concerns regarding CRRT delivery in a timely manner.

Regarding CRRT modality and anticoagulation, we were able to improve consistency of care and reduce CRRT variability by standardizing the CRRT protocol according to our local logistics and expertise. We achieved...
100% CVVHDF use, ~ 40% RCA use with > 70% of the CRRT time on RCA by the end of the study period. No other form of anticoagulation is routinely used when performing CRRT in our program unless the patient has specific indications for systemic anticoagulation. Even though we increased the CVVHDF use to the maximum, adherence to the citrate protocol should be further improved as evolving evidence suggests prolonged filter life span with RCA use.38,39 Challenges to widespread implementation of RCA use may be related to patient-specific factors (e.g., impaired liver metabolism under certain shock scenarios), feasibility of protocols for citrate titration and calcium supplementation, and clinician and nursing staff logistics and training. Furthermore, one should note that there is no evidence to support any specific CRRT modality over the other but reducing practice variability may prevent operator-related errors and therefore we selected a single modality of CRRT (e.g., CVVHDF) for our program.

CRRT dose is a dynamic metric that must be adjusted to the changing clinical needs of the patient8. According to Kidney Disease Improving Global Outcomes (KDIGO), it is recommended to achieve a delivered average CRRT effluent flow rate of 20–25 ml/kg/h, but ~ 30 ml/kg/h could be prescribed as interruptions, the use of pre-filter solutions and reductions in membrane permeability decrease the delivered dose8. Furthermore, the Acute CRRT effluent flow rate of 20–25 ml/kg/h, but ~ 30 ml/kg/h could be prescribed as interruptions, the use of pre-filter solutions and reductions in membrane permeability decrease the delivered dose8. Our results showed that the delivered CRRT effluent dose (~ 30 ml/kg/h) and the delivered/prescribed effluent dose ratio (~ 0.89) did not significantly change after QI interventions and remain adherent to guideline recommendations.

In relation to filter life, we managed to increase it from 26 to 31 h and decrease mean utilization of filters per patient from 3.56 to 2.67 despite no change in CRRT duration or mortality rates. Current evidence suggests optimization of circuit patency and filter performance primarily depends on anticoagulation practices (favoring RCA use)30,31, but there are still insufficient data to determine if preconditions (filter, vascular access site, catheter type) or patient characteristics (mechanical ventilation, SOFA score, calcium levels, platelet count, red blood cell transfusion, fibrinogen) may alter filter life31. Likewise, education to ICU nurses about filter management appears to increase its life span26,27, but evidence is still limited and more research is needed30. Therefore, it is important to document reasons for filter change and evaluate filter life span accordingly. As described by Mottes et al., there are planned filter changes (e.g., filter expiration, decision to stop therapy) and unplanned filter changes (e.g., cardiac arrest, emergent test or procedure, clotted circuit)30. We are currently working to improve our data collection to better examine specific reasons of filter change.

With respect to the number of access alarms per treatment, we reduced them by 43%. Although we did not assess for correlation with access placement site due to data availability, we hypothesize this could be a result of the iterative instruction to clinicians on proper catheter election and placement, in addition to enhanced education for ICU nurses on access alarm recognition, management and resolution.

The cost of CRRT relies on ICU nurse staffing salary, dialysate and/or replacement fluids, anticoagulation and extracorporeal circuit (including filter) costs34. It was estimated that a 24-h CVVHDF treatment costs ~ $1060 USD (excluding anticoagulation), but prices may vary from center to center35. After the described CRRT QI interventions, we improved our resource utilization (average filter life span and average total number of filters used per patient) and rendered ~ 20,000 USD gross savings in filter cost per 100-patient receiving CRRT at our institution. It is important to emphasize that these savings are only related to filter cost and do not account for other CRRT-related costs such as fluids, anticoagulation, monitoring or staffing salary.

Our study has some limitations to consider when interpreting the results. First, given the multifaceted quality assurance implementation, we cannot prove which specific QI interventions impacted any given outcome (e.g., RCA use vs. nurse education for improvement in filter life). Further, residual confounding is possible given the observational nature of this QI study. Second, this work was primarily planned to improve CRRT local care according to the characteristics and logistics of our institution, therefore our approach may not be applicable to other centers. Likewise, additional monitoring may be necessary to evaluate the sustainability of these results over time. However, we established a framework for quality assurance, analyzed a large number of patients (~ 7420 patient-day of CRRT) and made several measurements of CRRT QI metrics accepted in our scientific community to compare outcomes before and after QI interventions. Future directions include expanding our data collection to have additional tracking of CRRT QI metrics (e.g. intended vs. unintended filter changes, medication adjustments, fluid management, small solute clearance, adverse events, catheter dysfunction) as proposed by Rewa et al.16 and others12–14. Finally, this work exemplifies the ability to nurture collaborative and quality improvement work in the ICU.

Our findings indicate that through developing a multidisciplinary CRRT team, standardizing CRRT protocols, integrating machine/EHR data, and reinforcing education, we were able to improve adherence to protocols, confidently and sustainably track CRRT delivery and reduce filter resource utilization at our institution. Additional studies are needed to confirm these results and the impact of these QI initiatives on processes of care and patient-centered outcomes.

Methods
Setting. The University of Kentucky (UK) Albert B. Chandler Hospital is a 945-bed acute care hospital with more than 37,000 admissions and approximately 2500 medical ICU admissions per year23,24. The Nephrology ICU consultation team (consisting of one attending, one fellow, and one resident or advanced practitioner) provides diagnostic and therapeutic services for patients with AKI and ESKD requiring CRRT in the ICU. The provision of CRRT leans on a multidisciplinary approach, including intensivists, ICU nurses, pharmacists and many other specialists. We perform CRRT for approximately 500 patients annually, corresponding to ~ 3200 CRRT patient-day per year.
This QI study describes the development, implementation and outcomes of a quality assurance system to support the provision of CRRT to adult patients in the ICU. This QI study was approved by the University of Kentucky Institutional Review Board (IRB) of the Office of Research Integrity (17-0444-P1G). Requirement for informed consent was waived by the IRB (https://www.research.uky.edu/office-research-integrity). All methods were carried out in accordance with relevant guidelines and regulations.

Implementation. We developed and implemented a quality assurance system using a step-wise approach in 3 phases (intervention period, total of 10 months) (Fig. 3). The Phase I (3 months) consisted in the (a) assembly of a multidisciplinary team and the (b) standardization of the CRRT protocol tailoring institutional logistics and needs. The Phase II (4 months) involved the (c) creation of electronic CRRT flowsheets (Supplementary Fig. S2) and the (d) selection, monitoring and reporting of CRRT quality metrics. Finally, the Phase III (3 months) focused on the (e) enhancement of education to clinicians and ICU nurses.

We also established 3 study periods with the purpose of evaluating the impact of our intervention (Fig. 3). These periods were defined according to data availability before the intervention and the step-wise completion of milestones during the intervention phases. These periods consisted of: (1) before intervention (September 2016 to February 2017, 6 months); (2) intervention (March 2017 to December 2017, 10 months); and (3) after intervention (January 2018 to June 2019, 18 months).

Intervention. The 10-month intervention was carried out from March 2017 to December 2017 in 3 step-wise phases described in Table 3. Team development and protocol standardization (Phase I) allowed the establishment of a multidisciplinary quality assurance team (Supplementary Fig. S1) which reached consensus for CRRT protocols (modality, dose, access, and anticoagulation) based on revision of current guidelines, evidence-based practices, institutional logistics and local expertise. For the selection of CRRT QI metrics to monitor CRRT delivery (Phase II), we adapted via consensus the quality control system proposed by Joannes-Boyau et al.13 including structure metrics encompassing the CRRT provider (e.g., specialized team, education program) and the CRRT prescription (e.g. modality, prescribed dose, anticoagulation); and process (performance) metrics (e.g., delivered dose, filter life span, access alarms). A total of 11 CRRT QI metrics (study outcomes) under the domains of structure and process, and 3 subdomains (provider, prescription and performance) in addition to economic savings specific to filter use were selected for this study and are described in detail in Table 4. Preconditions such as type of CRRT machine, filter and catheter were not changed throughout the study period. For training and teaching (Phase III), we conducted dynamic monthly assessments of learning needs to tailor teaching activities for ICU nurses (New and Super Users) and clinicians. This was done by auditing CRRT charting, assessing machine specific performance data, and making rounds in the ICUs (Super Users were available in both day and night shifts). Clinical duties were not compromised as the QI officer and leadership of the program have protected time for these activities. Furthermore, physicians, ICU nurses and other healthcare professionals were invited to attend bi-monthly QI meetings in order to voice all concerns they were experiencing as well as to conduct an iterative assessment of the program.

Study data. Data from all adult patients (≥ 18 years old) receiving CRRT in the ICU during the study period were analyzed. Demographic and clinical data were collected by automated digital extraction from the EHRs through a flexible dashboard (Tableau, Supplementary Fig. S3), which allowed data to be downloaded as spreadsheets or graphics for review and further analysis. Data extraction was validated through individual review of EHRs. Performance data from CRRT machines were extracted from accessing individual machine data cards during the study period.
Table 4. Description of selected CRRT quality improvement metrics for this study. CRRT continuous renal replacement therapy, CVVHDF continuous veno-venous hemodiafiltration, ICU intensive care unit, QI quality improvement, RCA regional citrate anticoagulation.

| Quality domain: structure | Provider |
|--------------------------|----------|
|                         | The number of multidisciplinary experts that constitutes the CRRT QI team |
|                         | The number of education sessions for clinicians, ICU nurses and other healthcare professionals |
| Prescription             | CRRT modality |
|                         | The percentage of the total CRRT treatments that used CVVHDF as the main modality established by protocol |
|                         | Antiocoagulation |
|                         | The percentage of the total CRRT treatments that used RCA |
|                         | Total RCA/RCA-CRRT hours |
|                         | The average total RCA hours divided by total CRRT hours in patients that used RCA |

| Quality domain: process |
|------------------------|
| Performance            |
|                        | Delivered effluent dose |
|                        | The average delivered CRRT effluent flow rate (ml/kg/h) |
|                        | Delivered vs. prescribed effluent dose |
|                        | The average delivered CRRT effluent dose divided by prescribed dose |
|                        | Filter life span |
|                        | The average time (in hours) of individual filter utilization |
|                        | Filters per patient |
|                        | The average total number of filters used divided by the total number of patients on CRRT |
|                        | CRRT access alarms |
|                        | The average number of CRRT access alarms per treatment day, reflecting catheter malfunction |
|                        | (high venous pressure in return line or low arterial pressure in access line) |
|                        | Economic savings |
|                        | The average gross total filter cost per 100-patient receiving CRRT |

Statistical analysis. Categorical variables are expressed as counts and percentages. Continuous variables are reported as mean and standard deviation (SD), or median and interquartile range (IQR) according to data distribution. A chi-square test or Fisher's exact test was used to compare categorical variables when appropriate. Continuous variables with a normal distribution were compared using an independent Student t-test; in contrast, variables not exhibiting a normal distribution were compared using the Mann–Whitney U test. All statistical analyses were performed using SPSS 24.0 (IBM SPSS Statistics for Windows, Version 24.0. Armonk, NY: IBM Corp). A two-tailed p < 0.05 was considered statistically significant.

Ethics approval and consent to participate. This QI study was approved by the University of Kentucky Institutional Review Board (IRB) of the Office of Research Integrity (17-0444-P1G). Requirement for informed consent was waived by the IRB (https://www.research.uky.edu/office-research-integrity). All methods were carried out in accordance with relevant guidelines and regulations.

Data availability
The datasets used and/or analyzed during the current study are available from the corresponding author on reasonable request.

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References
1. Heung, M. & Yessayan, L. Renal replacement therapy in acute kidney injury: Controversies and consensus. Crit. Care Clin. 33, 365–378 (2017).
2. Connor, M. J. & Karakala, N. Continuous renal replacement therapy: Reviewing current best practice to provide high-quality extracorporeal therapy to critically ill patients. Adv. Chronic Kidney Dis. 24, 213–218 (2017).
3. Tandukar, S. & Palevsky, P. M. Continuous renal replacement therapy: Who, when, why, and how. Chest 155, 626–638 (2019).
4. Uchino, S. et al. Acute renal failure in critically ill patients: A multinational, multicenter study. JAMA 294, 813 (2005).
5. Rewa, O. & Bagshaw, S. M. Acute kidney injury—epidemiology, outcomes and economics. Nat. Rev. Nephrol. 10, 193–207 (2014).
6. Thongprayoon, C., Cheungpasitporn, W. & Ahmed, A. H. Trends in the use of renal replacement therapy modality in intensive care unit: A 7 year study. Ren. Fail. 37, 1444–1447 (2015).
7. Susantitaphong, P. et al. World incidence of AKI: A meta-analysis. Clin. J. Am. Soc. Nephrol. 8, 1482–1493 (2013).
8. Kellum, J. A. et al. Kidney disease: Improving global outcomes (KDIGO) acute kidney injury work group. KDIGO clinical practice guideline for acute kidney injury. Kidney Int. Suppl. 2, 1–138 (2012).
9. Bagshaw, S. M. et al. Current state of the art for renal replacement therapy in critically ill patients with acute kidney injury. Intensive Care Med. 43, 841–854 (2017).
10. Rewa, O. G. et al. Quality indicators of continuous renal replacement therapy (CRRT) care in critically ill patients: A systematic review. Intensive Care Med. 43, 750–763 (2017).
11. Neyra, J. A. & Goldstein, S. L. Optimizing renal replacement therapy deliverables through multidisciplinary work in the intensive care unit. Clin. Nephrol. 90, 1–13 (2018).
12. Mottes, T. A., Goldstein, S. L. & Basu, R. K. Process based quality improvement using a continuous renal replacement therapy dashboard. BMC Nephrol. 20, 1–10 (2019).
13. Joannes-Boyau, O., Velly, L. & Ichai, C. Optimizing continuous renal replacement therapy in the ICU: A team strategy. Curr. Opin. Crit. Care 24, 476–482 (2018).
14. Shen, B. et al. Continuous renal replacement therapy quality control and performance measures. *Contrib. Nephrol.* **194**, 134–145 (2018).

15. Mottes, T. A. Does your program know its AKI and CRRT epidemiology? The case for a dashboard. *Front. Pediatr.* **8**, 8–11 (2020).

16. Rewa, O. G., Eurchik, D. T., Noel Gibney, R. T. & Bagshaw, S. M. A modified Delphi process to identify, rank and prioritize quality indicators for continuous renal replacement therapy (CRRT) care in critically ill patients. *J. Crit. Care* **47**, 145–152 (2018).

17. Oh, H. J. et al. The benefit of specialized team approaches in patients with acute kidney injury undergoing continuous renal replacement therapy: Propensity score matched analysis. *Crit. Care* **18**, 1–9 (2014).

18. Rhee, H. et al. The role of the specialized team in the operation of continuous renal replacement therapy: A single-center experience. *BMC Nephrol.* **18**, 1–9 (2017).

19. Graham, P. & Lischer, E. Nursing issues in renal replacement therapy: Organization, manpower assessment, competency evaluation and quality improvement processes. *Semin. Dial.* **24**, 183–187 (2011).

20. Mottes, T. et al. Improving delivery of continuous renal replacement therapy: Impact of a simulation-based educational intervention. *Pediatr. Crit. Care Med.* **14**, 747–754 (2013).

21. Page, M. et al. Impact d’un programme d’amélioration de la stabilité de l’épuration extrarénale continue. *Ann. Fr. Anesth. Reanim.* **33**, 626–630 (2014).

22. Griffin, B. R. et al. Continuous renal replacement therapy dosing in critically ill patients: A quality improvement initiative. *Am. J. Kidney Dis.* **74**, 727–735 (2019).

23. Mayer, K. P. et al. Safety, feasibility, and efficacy of early rehabilitation in patients requiring continuous renal replacement: A quality improvement study. *Kidney Int. Rep.* **5**, 39–47 (2020).

24. Neyra, J. A., Ortiz-Soriano, V. M., Ali, D., Morris, P. E. & Johnston, C. M. A multidisciplinary approach for the management of severe hypernatremia in patients requiring continuous renal replacement therapy. *Kidney Int. Rep.* **4**, 59–66 (2019).

25. Ogrinc, G. et al. SQUIRE 2.0 (Standards for QUality Improvement Reporting Excellence): Revised publication guidelines from a detailed consensus process. *BMJ Qual. Saf.* **25**, 986–992 (2016).

26. Kashani, K. et al. Quality improvement goals for acute kidney injury. *Clin. J. Am. Soc. Nephrol.* **14**, 941–953 (2019).

27. Askenazi, D. J. et al. Optimal role of the nephrologist in the intensive care unit. *Blood Purif.* **43**, 68–77 (2017).

28. Tolwani, A. J., Prendergast, M. B., Speer, R. R., Stefan, B. S. & Wille, K. M. A practical citrate anticoagulation continuous venovenous hemodiafiltration protocol for metabolic control and high solute clearance. *Clin. J. Am. Soc. Nephrol.* **1**, 79–87 (2006).

29. Liu, C., Mao, Z., Kang, H., Hu, J. & Zhou, F. Regional citrate versus heparin anticoagulation for continuous renal replacement therapy in critically ill patients: A meta-analysis with trial sequential analysis of randomized controlled trials. *Crit. Care* **20**, 144 (2016).

30. Wu, M. Y. et al. Regional citrate versus heparin anticoagulation for continuous renal replacement therapy: A meta-analysis of randomized controlled trials. *Am. J. Kidney Dis.* **59**, 810–818 (2012).

31. Bui, M. et al. Citrate versus heparin anticoagulation for continuous renal replacement therapy: an updated meta-analysis of RCTs. *Intensive Care Med.* **41**, 2098–2110 (2015).

32. Bagshaw, S. M. et al. Precision continuous renal replacement therapy and solute control. *Blood Purif.* **42**, 238–247 (2016).

33. Brain, M., Winson, E., Roozenburg, O. & McNeil, J. Non anti-coagulant factors associated with filter life in continuous renal replacement therapy (CRRT): A systematic review and meta-analysis. *BMC Nephrol.* **18**, 1–27 (2017).

34. Srisawat, N., Lawsin, L., Uchino, S., Bellomo, R. & Kellum, J. A. Cost of acute renal replacement therapy in critically ill patients: Results from The Beginning and Ending Supportive Therapy for the Kidney (BEST Kidney) Study. *Crit. Care* **14**, R46 (2010).

35. Ahmed, Z., Gilibert, S. & Krevolin, L. Cost analysis of continuous renal replacement and extended hemodialysis. *Dial. Transplant.* **38**, 500–503 (2009).

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**Author contributions**

Research idea and study design: E.F.R., M.L.T.B., K.P.M., J.A.N.; data acquisition: E.F.R., V.M.O.S., M.T., B.A.K., R.D.; data analysis/interpretation: all authors; statistical analysis: E.F.R., V.M.O.S.; manuscript writing: E.F.R. and J.A.N.; study supervision: J.A.N. Each author contributed important intellectual content during manuscript drafting or revision and accepts accountability for the overall work.

**Competing interests**

MLTB and JAN have provided consulting services to Baxter Healthcare, Inc. All other authors have nothing to disclose.

**Additional information**

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**Correspondence** and requests for materials should be addressed to J.A.N.

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The University of Kentucky CRRT Quality Assurance Group

Madona Elias¹Mark Taylor¹Josh McHatton¹Juan Carlos Aycinena³Angel M. Diaz ¹Stacy A. Mason³Megan A. Perkins¹B. Peter Sawaya¹Kelly R. Fedder¹Amanda Hornsby²Natalie Noell¹Thomas A. Tribble ³Jillian M. Kouns ¹