### **RESEARCH ARTICLE**



# The clinical significance of renal resistance index (RRI) and renal oxygen saturation (RrSO2) in critically ill children with AKI: a prospective cohort study

Huili Shen<sup>1,2</sup>, Weilan Na<sup>2</sup>, Yichu Li<sup>1</sup> and Dong Qu<sup>2\*</sup>

### Abstract

**Objective** The purpose of this study was to look into the clinical significance of the renal resistance index (RRI) and renal oxygen saturation (RrSO2) in predicting the development of acute kidney injury (AKI) in critically ill children. A new non-invasive method for the early detection and prediction of AKI needs to develop.

**Methods** Patients admitted to the pediatric intensive care unit (PICU) affiliated with the capital institute of pediatrics from December 2020 to March 2021 were enrolled consecutively. Data of clinical information, renal Doppler ultrasound, RrSO2, and hemodynamic index within 24 h of admission were prospectively collected. Patients were divided into two groups: the study group was AKI occurred within 72 h, while the control group did not. SPSS (version 25.0) was used to analyze the data, and P < 0.05 was considered a statistical difference.

**Results** 1) A total of 66 patients were included in this study, and the incidence of AKI was 19.70% (13/66). The presence of risk factors (shock, tumor, severe infection) increased the incidence of AKI by three times. 2) Univariate analysis showed significant differences in length of hospitalization, white blood cells (WBC), C-reactive protein (CRP), renal resistance index (RRI), and ejection fraction (EF) between the study and control groups (P < 0.05). There were no significant differences in renal perfusion semi-quantitative score (P = 0.053), pulsatility index (P = 0.051), pediatric critical illness score (PCIS), and peripheral vascular resistance index (P > 0.05). 3) Receiver operating characteristic (ROC) curve showed that if RRI > 0.635, the sensitivity, specificity, and AUC for predicting AKI were 0.889, 0.552, and 0.751, respectively; if RrSO2 < 43.95%, the values were 0.615, 0.719 and 0.609, respectively; if RRI and RrSO2 were united, they were 0.889, 0.552, and 0.766, respectively.

**Conclusions** The incidence of AKI is high in PICU patients. And infection, RRI, and EF are risk factors for AKI in PICU patients. RRI and RrSO2 have certain clinical significance in the early prediction of AKI and may provide a new non-invasive method for early diagnosis and prediction of AKI.

Keywords Acute kidney injury (AKI), Renal resistance index (RRI), Renal oxygen saturation (RrSO2)

#### \*Correspondence:

Dong Qu

qudong2012@126.com

<sup>1</sup> Pediatric Intensive Care Unit, Children's Hospital of Fudan University,

National Children's Medical Center, Shanghai, China

<sup>2</sup> Pediatric Critical Medicine Department, Children's Hospital of Capital

Institute of Pediatric, Beijing, China



© The Author(s) 2023. **Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/ficenses/by/4.0/. The Creative Commons Public Domain Dedication waiver (http://creativecommons.org/publicdomain/zero/1.0/) applies to the data made available in this article, unless otherwise stated in a credit line to the data.

#### Background

Acute kidney injury (AKI) is characterized by a rapid decline in kidney function caused by various factors (shock, sepsis, surgery). The clinical manifestations of AKI are a rapid rise in serum creatinine (SCr) accompanied or not accompanied by decreased urine volume, azotemia, and water/acid-base electrolyte imbalance. A global epidemiological study of AKI [1] showed that the incidence of AKI in intensive care unit (ICU) was about 30%, and the mortality rate was about 3.4%. In PICU, the proportion of septic shock with AKI is as high as 41–73% [2], and 35.7% of children develop AKI STAGE II or III AKI [3]. Septic shock with AKI resulted in death or disability in 64% of children.

At the moment, AKI is primarily diagnosed based on changes in urine volume and SCr. Due to the strong reserve function of the kidney, both of them lag behind the injury and recovery of renal function [4], which are not conducive to the early recognition of AKI. Some non-invasive, effective, bedside and convenient diagnostic indicators are expected to be discovered constantly.

Doppler ultrasound is a non-invasive, rapid, repeatable, and inexpensive examination tool increasingly used in diagnosing and treating critical patients. Renal resistance index (RRI) based on Doppler ultrasound is the ultrasonic signal of interlobar artery blood flow at the Renal cortical medullary junction obtained [5], which is now considered to reflect renal perfusion and vessels [6, 7]. Moreover, RRI had a predictive effect on AKI diagnosis and can reasonably evaluate kidney structure and function.

Near-infrared spectroscopy (NIRS) [8] is a non-invasive bedside tissue oxygen saturation monitoring instrument that can reflect the oxygen supply and demand status of tissues and organs about 4–6 cm beneath the skin [9, 10]. The value of NIRS can be obtained instantaneously and is not affected by low temperature, hypoperfusion, and arterial contraction. Patients with cardiac arrests can also use it. Studies showed that NIRS could accurately detect changes in tissue oxygen. The subcutaneous tissue of children is thin, and the kidney is a retroperitoneal organ close to the skin; kidney tissue oxygen saturation can be monitored.

Existing research indicates that AKI is a common microcirculation disorder. RRI and RrSO2 can theoretically reflect the pathophysiological mechanism of AKI. RRI combined with RrSO2 may theoretically be an effective indicator for clinical prediction and evaluation of AKI, but no relevant scientific studies have been conducted to date. In this paper, RRI and RrSO2 of patients were obtained prospectively within 24h of admission, and the clinical effects in predicting AKI occurrence. We aimed to provide a non-invasive and convenient bedside method for the early diagnosis of AKI.

#### Methods

#### **Clinical data**

All patients admitted to the PICU of our hospital from December 2020 to March 2021 were enrolled. Within 24h of admission, clinical data, renal Doppler ultrasound data, and NIRS data were collected from patients. Patients were divided into study and control groups according to whether AKI occurred in the first 72h or not, respectively.

#### Inclusion criteria and exclusion criteria Inclusion criteria

(1) Age from 29 days to 18 years; (2) The diagnostic criteria for AKI were according to KDIGO grading criteria, and PCIS was based on pediatric critical case score; (3) Vasoactive drug score (VIS)=dopamine+do butamine+ $10 \times$  milinone+ $100 \times$  epinephrine + $100 \times$  norepinephrine(ug/kg/min) -.

#### **Exclusion criteria**

(1) Age  $\leq 28$  days or age  $\geq 18$  years old; (2) Kidney distance measured by ultrasound exceeds NIRS detection range; (3) Patients with chronic kidney dysfunction, underwent kidney surgery or renal vascular abnormalities, renal tumor, renal mass, renal dilatation, hydronephrosis, etc.; (4) Length of the stay less than 72 h; (5) Patient or parental refusal to participate in the study.

#### **Research methods**

### All the enrolled patients were treated according to relevant diagnosis and treatment standards

All the data were collected, which include (1) demographic information: age, sex, height, weight, and vital signs; (2) laboratory test results; (3) bedside ultrasound values: renal length and width, renal blood perfusion semi-quantitative score, RRI, renal Pulpability index (PI); (4) hemodynamic index; (6) prognostic data of patients: PCIS, VIS, fluid intake and hospital length of stay, the incidence of AKI 72h after admission. RRI=(systolic peak velocity–end-diastolic blood flow rate)/systolic peak velocity. PI=(peak systolic tachycardia–end diastolic blood flow rate)/[peak systolic tachycardia+end diastolic blood flow rate)/2].

According to the anatomical point (the renal hilum is located at the rib ridge angle) and the retest position of the renal ultrasound positioning, the probe was placed at the point on the surface of the kidney and kept attached without a light source around it. The patient's information was considered as input, and then the measurement started. After making a stable measurement for 5 min,

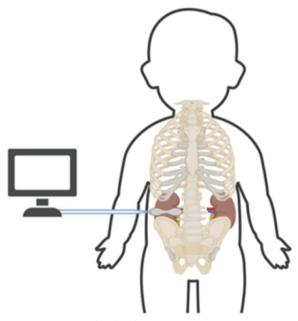


Fig. 1 NIRS usage and probe placement

RrSO2 was obtained. Figure 1 presents the specific measurement method.

USCOM instrument (USCOM, Austria, non-invasive Doppler hemodynamic instrument) was used for getting hemodynamic indicators.

#### Statistical methods

For statistical analysis, SPSS software (version 25.0) was used. The central tendency of a normal distribution or near normal distribution was expressed by mean  $\pm$  standard deviation (Mean  $\pm$  SD). The quantitative data were tested using an independent sample t-test, and the qualitative data were tested using  $X^2$  test. The median (interquartile spacing) [M(IQR)] was used to represent the central tendency of the non-normal distribution using the rank-sum test (Mann-Whitney U test).

Logistic regression analysis was used for multivariate analysis. After the regression curve was obtained, RRI, RrSO2, and combined application RRI and RrSO2 were used to plot Receiver operating characteristic (ROC) curves. A statistically significant difference was defined as P < 0.05.

#### Results

#### Incidence of AKI and risk factors in PICU patients

A total of 66 patients were included, encompassing 39 males and 27 females, with a male to female ratio of 1.44:1. AKI occurred in 13 (19.7%) patients within 72 h of admission. The incidence of AKI was 19.70% (13/66), with AKI stage I occurring on 5/13 (38.46%), AKI stage

II appearing on 4/13(30.77%), and AKI stage III on 4/13(30.77%). Table 1 lists the specific risk factors for AKI that were present in 24 of the 66 patients. Among the 24 patients with risk factors, 8/24 (33.3%) had AKI. AKI occurred in 5/24 (11.9%) patients without identifiable risk factors. The incidence of AKI is approximately three times higher when risk factors are present.

#### Univariate analysis of AKI patients

In order to reduce the influence of age, gender, and other demographic baselines, SPSS was used to match the patients: Study group: control group=1:2.5 (matching index: Age, sex, weight, and height). After matching, we had 13 patients in the study group and 33 in the control group.

As shown in Fig. 2, no statistical difference was found in baseline values of age, gender, weight, and height between the two groups (P>0.05).

Univariate analysis revealed statistical differences between the two groups in length of hospital stay, WBC, CRP, RI, and Ejection fraction (EF) (P < 0.05). Although no statistical differences in a semi-quantitative score of renal perfusion and PI were found, the *P*-value of the two groups was at the critical value of 0.05. The former is 0.053 and the latter 0.051. Table 2 shows that other indicators, such as many risk factors, PCIS value, and peripheral blood flow dynamics parameters, showed no statistical difference (P > 0.05).

#### Multifactor analysis of AKI patients

Logistic regression was used to examine the indexes that showed statistical differences in univariate analysis: RRI, WBC, CRP, and EF. Since the length of hospitalization is a prognostic factor and is not an independent risk factor for AKI in clinical interpretation, the length of hospitalization was not included in the logistic regression analysis. The results showed that none of the above factors were independent risk factors for AKI in PICU patients. The independent risk factors for ICU admission should be investigated further.

Tab	le '	1	Analy	sis (	of	risk	factors	in	24	patients
-----	------	---	-------	-------	----	------	---------	----	----	----------

Count (%)		
7(29.2%)		
4(16.7%)		
4(16.7%)		
10(41.7%)		
4(16.7%)		
1(4.2%)		

A patient may have multiple risk factors

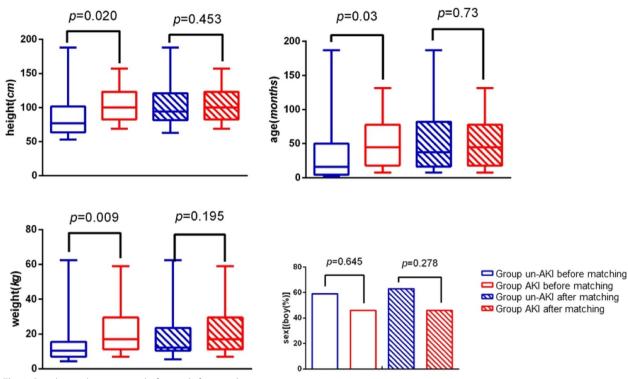


Fig. 2 Population characteristics before and after matching

## Predictive value of RI, RrSO2, and RRI combined with RrSO2 for AKI occurrence

ROC curve showed that the sensitivity, specificity, and area under the curve (AUC) for predicting AKI in ICU patients with RI > 0.635 were 0.889, 0.552, and 0.751, respectively, while those data with RrSO2 < 43.95% were 0.615, 0.719 and 0.609 respectively. The sensitivity, specificity, and AUC were 0.889, 0.552, and 0.766 when they were combined, as shown in Fig. 3 and Table 3.

## Renal ultrasonography and dynamic changes of RrSO2 in patients with shock patients

As previously stated, shock is a risk factor for AKI. Renal Doppler ultrasound and renal NIRS values of patients with shock were continuously monitored to understand better the predictive value of RrSO2 combined with RRI in AKI.

All the following shock patients recovered and were discharged. The results showed that RI gradually decreased and RrSO2 gradually increased with the improvement of patients' condition. Figures 4 and 5 depict the specific findings of the study.

#### Discussion

AKI is a common disease in intensive care medicine. Epidemiological survey results show that the overall incidence of AKI in China is 11.6% [11], and the incidence of AKI in ICU patients globally is 26.9% [1]. This study found that the incidence of AKI in PICU is 19.70% (13/66), roughly consistent with previous studies. Various factors can cause AKI, and common clinical risk factors include shock, sepsis, tumor, etc. This study found that the existence of risk factors can increase the incidence of AKI by about three times, and patients with AKI will have more than two times of risk factors (see Table 4). Kaddourah [1] et al. found that septic shock was the main risk factor for AKI, which was consistent with this study. Furthermore, this study found that tumors, especially tumor cytolysis, would increase the incidence of AKI in patients, which is considered related to increased metabolic pressure in the kidney after tumor cell lysis. Thus, patients with tumors, especially those with tumor cytolysis, should be paid attention to in the clinic.

This study found statistical differences in WBC and CRP between the control and study groups (P < 0.05). Those two indexes are both about inflammation. As stated earlier, severe infections are high-risk factors for AKI. Previous studies had found that patients with sepsis AKI associated with capillary endothelial injury, renal interstitial neutrophils, and other inflammatory cells infiltration. Simultaneously, the body of the active oxygen free radicals and reactive nitrogen free radicals produce too much will lead to oxidation and antioxidant imbalance, leading to renal tissue injuries [12]. The

#### Table 2 Univariate analysis of AKI patients

Demographic	Whole cohort (n=46)	AKI (n = 13)	No AKI ( <i>n</i> = 33)	Statistic	P value
Sex [male, count (%)]	27(58.70)	6(46.20)	21(63.60)	1.176	.278
Age ( <i>Mean</i> $\pm$ <i>SD</i> , M)	$49.95 \pm 38.35$	$53.11 \pm 39.85$	$48.71 \pm 38.30$	341	.730
Hospital stays [ <i>M(IQR</i> ), d]	6.00(4.25,9.00)	5.00(4.00,5.75)	8.00(5.00,10.75)	-2.122	.035
Risk factors [count (%)]	20(43.48)	8(61.50)	12(36.40)	2.405	.121
P/F (Mean $\pm$ SD, score)	$242.23 \pm 101.77$	$254.68 \pm 135.56$	$236.37 \pm 85.92$	412	.684
PCIS (Mean $\pm$ SD, score)	$89.30 \pm 8.74$	$88.46 \pm 8.69$	$89.64 \pm 8.87$	.407	.686
MAP ( <i>Mean</i> $\pm$ <i>SD</i> , mmHg)	$75.09 \pm 14.52$	$77.08 \pm 15.42$	$74.30 \pm 14.32$	579	.565
WBC[ $M(IQR)$ , $\times 10^{9}$ /L]	9.20(4.40,11.64)	11.40(9.74,17.21)	6.47(3.60,10.18)	-2.818	.005
Hb (Mean $\pm$ SD, g/L)	$98.00 \pm 23.52$	$89.62 \pm 30.01$	$101.30 \pm 20.01$	1.541	.131
CRP[ <i>M(IQR</i> ), mg/L]	5.66(1.23,19.50)	12.73(4.98,40.11)	4.25(0.60,15.01)	-2.038	.042
Lac[ <i>M(IQR)</i> , mmol/L]	1.50(1.08,2.33)	1.50(1.00,3.22)	1.50(1.05,2.05)	122	.903
PCT[ <i>M(IQR)</i> , ng/ml]	0.49(0.17,2.16)	0.54(0.23,11.82)	0.45(0.15,2.04)	-1.122	.262
Cr[ <i>M(IQR</i> ), µmol/L]	27.20(19.98,32.15)	32.30(26.35,38.45)	24.50(19.85,29.80)	-1.752	.104
$RI(Mean \pm SD)$	$0.65 \pm 0.11$	$0.71 \pm 0.09$	$0.63 \pm 0.10$	-2.374	.023
Semi-quantitative score of renal perfusion [ <i>M(IQR</i> ), score]	3.00(1.25,3.00)	1.50(0.25,3.00)	3.00(2.00,3.00)	7.675	.053
RrSO2 (Mean $\pm$ SD, %)	$46.03 \pm 18.45$	$40.43 \pm 20.52$	$48.31 \pm 17.36$	1.309	.197
Kidney length ( <i>Mean</i> $\pm$ <i>SD</i> , cm)	$6.62 \pm 0.97$	$6.84 \pm 1.25$	$6.51 \pm 0.82$	-1.015	.316
Kidney width ( <i>Mean</i> $\pm$ <i>SD</i> , cm)	$3.36 \pm 0.51$	$3.42 \pm 0.56$	$3.33 \pm 0.50$	532	0.50
PI (Mean $\pm$ SD)	$1.08 \pm 0.29$	$1.24 \pm 0.33$	$1.02 \pm 0.26$	-2.017	.051
EF[ <i>M</i> ( <i>IQR</i> ), %]	70.00(63.00,72.00)	60.50(48.50,69.75)	71.00(66.00,72.50)	-2.469	.014
VIS[ <i>M(IQR)</i> , score]	0.00(0.00,0.00)	0.00(0.00,2.50)	0.00(0.00,0.00)	430	.667
Intake and output volume ( <i>Mean</i> $\pm$ <i>SD</i> , ml/d)	$388.92 \pm 544.33$	$352.62 \pm 485.49$	$403.23 \pm 572.30$	.281	.780
SVI (Mean $\pm$ SD, mI/m <sup>2</sup> )	$34.35 \pm 11.63$	$34.08 \pm 10.63$	$34.45 \pm 12.158$	.098	.922
CI (Mean $\pm$ SD, L/min/m <sup>2</sup> )	$4.37 \pm 1.45$	4.22±1.31	$4.43 \pm 1.52$	.448	.657
SVRI (Mean $\pm$ SD, ds·m <sup>2</sup> /cm <sup>5</sup> )	$1477.02 \pm 754.69$	1461.08±674.512	1483.30±793.84	.089	.930
SVV (Mean $\pm$ SD, %)	$43.48 \pm 23.95$	$34.62 \pm 21.45$	$46.97 \pm 24.29$	1.602	.116
DO2[ <i>M(IQR</i> ), ml/min]	328.00(233.00,524.00)	328.00(200,627.50)	343.00(233.00,502.00)	180	.857

PCIS Pediatric critical illness scoring, MAP Mean arterial pressure, WBC White blood cell, HB Hemoglobin, CRP C-reactive protein, Lac Lactate, PCT Procalcitonin, Cr Creatinine, R/ Renal index, PI Pulpability index, RrSO2 renal regional tissue oxygen saturation, EF Ejection fraction, SV Stroke volume, SVI Stroke volume index, CI Cardiac index, SVR/ Systemic vascular resistance index, SVV Stroke volume variability, DO2 Oxygen delivery

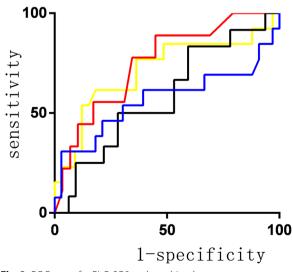


Fig. 3 ROC curve for RI, RrSO2 and combined

imbalance of the NF- $\kappa$ B signaling pathway is the primary mechanism of AKI, which is essentially an inflammatory change and a microcirculation disorder. There were statistical differences in inflammatory indicators between the two groups in the present study, confirming that AKI is an inflammatory response. The univariate analysis also showed a statistical difference in the length of hospital stay between the two groups. Previous research suggested that the occurrence of AKI would increase hospital stay and extend the duration of mechanical ventilation [13]. It demonstrates that the presence of AKI can significantly increase the use of medical resources and that early detection and diagnosis of AKI have important clinical implications.

In this study, renal ultrasound and NIRS monitoring were performed in patients with AKI within 24h of admission. We found that RRI increased and RrSO2 decreased before creatinine increased, and renal blood perfusion semi-quantitative score decreased, especially

ltem	Sensitivity	Specificity	AUC	Р	95%Cl	
					upper	lower
RI > 0.635	.889	.552	.751	.025	.574	.928
RI combined RrSO2	.889	.552	.766	.017	.587	.946
RrSO2 < 43.95%	.615	.719	.609	.328	.403	.815
Cr>27.1 µmol/L	.769	.424	.714	.025	.530	.899

#### Table 3 Predictive value of RI, RrSO2 and RRI combined with RrSO2 for AKI occurrence

#### Renal index

ROC Receiver operating characteristic, AUC Area under curve, CI Confidence interval, RrSO2 renal regional tissue oxygen saturation

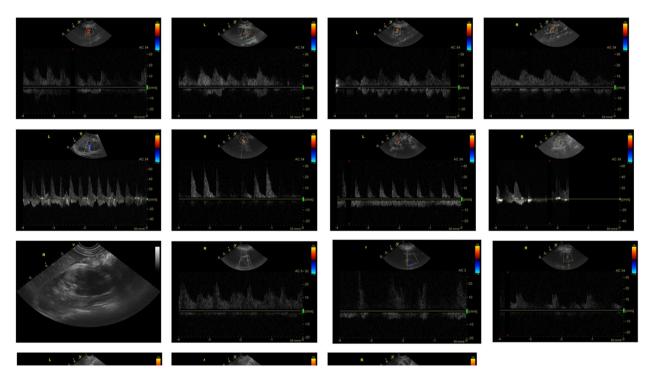


Fig. 4 Dynamic ultrasound changes of shock patients. Note: From top to bottom, each line represents a patient, and from left to right each line represents the ultrasound changes of the patient from admission to the fourth day respectively

in critically ill patients (see Fig. 4). As the patient's disease improves, RRI, RrSO2, and renal perfusion change early. These findings indicated that RRI and RrSO2 changes occurred earlier than SCr, a traditional AKI diagnostic index. RRI primarily reflects the condition of renal cortex blood flow. According to existing research, at the onset of AKI, there will be a redistribution of blood flow of cortical blood flow, and the medulla is little. Simultaneously, in the early days of AKI, to protect cardiopulmonary function, renal vasoconstriction, blood supply is reduced, resulting in the appearance of RRI, and in patients with severe infection, inflammation leads to AKI progression, and renal blood flow is decreased further [14]. A study of 92 patients with shock found that the RRI of patients with shock was higher than that of patients without shock [15]. This is consistent with shock patients having a significantly higher RRI value in this study. According to Zhao Peng et al. [16], the renal resistance index can better reflect the degree of renal injury in patients with sepsis complicated by AKI.

The study found that RrSO2 decreased in the early stages of AKI but gradually increased in critically ill patients (Fig. 5) with disease recovery, implying that RrSO2 is a good predictor of AKI. There was no statistical difference between the two groups in single factor analysis. Considering that the onset of AKI was characterized

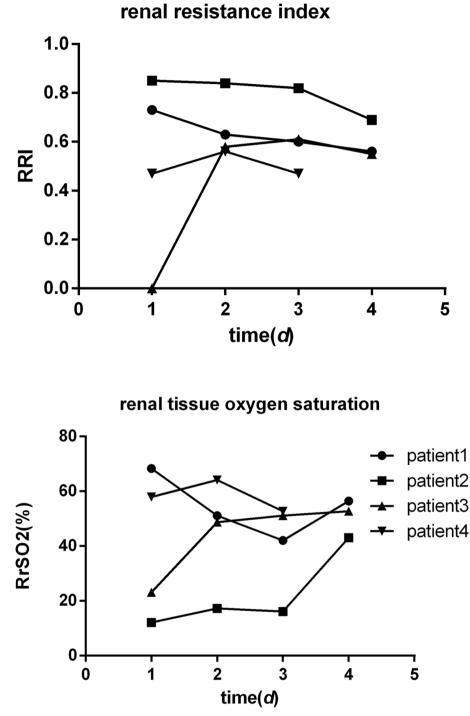


Fig. 5 Changes in RrSO2 and RRI at 4 patients

by medulla hypoxia first and cortical hypoxia later than medulla [17], RrSO2 was primarily monitored in the renal cortex, and no difference was observed in the early stage of AKI (24h). Simultaneously, changes in RrSO2 also indicate that AKI is a microcirculation disorder. Studies have found that abnormal microcirculation perfusion and oxygen metabolism disorder are two critical factors affecting renal injury in septic shock, which is of great significance for the assessment of AKI [18]. In several recent pediatric cardiac surgeries, low oxygen

ltem	В	S.E.	Wald	Р	OR	95%CI OR	
						upper	lower
RI	52.904	41.501	1.625	.202	9.459E22	.000	2.003E58
WBC	.575	.495	1.353	.245	1.778	.674	4.687
CRP	.045	.053	.725	.394	1.046	.943	1.159
EF	463	.287	2.609	.106	.629	.359	1.104
constant	-17.147	27.521	.388	.533	.000		

Table 4 Logistic regression analysis of risk factors for AKI in PICU patients

PICU Pediatric intensive care medicine, AKI Acute kidney injury, RI Renal index, WBC White blood cell, CRP C-reactive protein, EF Ejection fraction

saturation was positively correlated with AKI. Furthermore, Ruf et al. [19] found that low renal oxygen was positively correlated with lactic acid elevation 24 h after surgery. Francesco et al. [20] found that renal oxygen reduction on the first day after birth is closely related to AKI.

ROC curve showed that the AUC of RRI predicting the occurrence of AKI within 72h was 0.751, which was consistent with Liu's study [21]. RrSO2 has a reasonable specificity for the diagnosis of AKI. The early prediction value of RRI combined with RrSO2 for AKI did not improve sensitivity and specificity, and the combination only increased a certain area under the curve, which was consistent with the result of the single factor analysis finding no statistical difference between RrSO2 and AKI. However, the sensitivity, specificity, and AUC of RI and their combination were higher than the current gold standard for AKI. NIRS can well reflect the oxygenation of the microvascular [22], RRI and the RI joint RrSO2 can better predict the occurrence of AKI, and can be used as an early predictor of clinical predict AKI.

Unlike previously thought, the mechanism of AKI mainly lies in glomerular and tubular cell necrosis caused by insufficient renal blood flow [23]. At present, abnormal renal microcirculation and mitochondrial dysfunction are considered to be important mechanisms for the occurrence and development of AKI [24]. RRI and RrSO2 are both non-invasive indicators. And their combination has significant implications for the early treatment of AKI, which can be applied in future studies. Xing Zhiqun et al. [25] found that high RRI (RRI > 0.7) and low urinary oxygen partial pressure (<448 mmHg) are independent risk factors for AKI in septic shock patients, and combined application of RRI and urinary oxygen partial pressure can be an early predictor of AKI in septic shock patients.

However, this study also has the following limitations. It is a single-center, prospective study with a small sample size that must be expanded regularly. Meanwhile, the application of RrSO2 still has many limitations [26].

NIRS can only reflect the local tissue oxygen saturation and not the overall oxygen saturation of the organ. Simultaneously, NIRS measurements are influenced by height, weight, local tissue, muscle, and subcutaneous fat. As a result, many limitations exist if the children have edema, obesity, or are underweight.

#### Conclusions

To summarize, AKI is a fairly common disease. For patients admitted to PICU, infection, RRI, and EF are risk factors for AKI. RRI within 24h of admission can predict the occurrence of AKI within 72h, RRI combined with RrSO2 can better predict the occurrence of AKI, which can be used as an early indicator for the prediction of AKI.

#### Abbreviations

AKI	Acute kidney injury
AUC	Area under curve
CI	Cardiac index
CRP	C-reactive protein
DO2	Oxygen delivery
EF	Ejection fraction
HB	Hemoglobin
LAC	Lactate
MAP	Mean arterial pressure
NIRS	Near infrared spectroscopy
PCIS	Pediatric critical illness score
PCT	Procalcitonin
PI	Pulpability index
PICU	Pediatric intensive care unit
ROC	Receiver operating characteristic
RRI	Renal resistance index
RrSO2	Renal oxygen saturation
SCr	Serum creatinine
SV	Stroke volume
SVI	Stroke volume index
SVRI	Systemic vascular resistance index
SVV	Stroke volume variability

#### Acknowledgements

Not applicable.

#### Authors' contributions

HS: Conception and design, provision of study material or patients, manuscript writing, final approval of manuscript. WN and YL: Manuscript writing, data analysis and interpretation. DQ: Conception and design, final approval of manuscript. The authors read and approved the final manuscript.

#### Funding

The Special Fund of the Pediatric Medical Coordinated Development Center of Beijing Hospitals Authority (XTCX201820).

#### Availability of data and materials

The data and material used or analysed during the current study are available from the corresponding author on reasonable request.

#### Declarations

#### Ethics approval and consent to participate

All the patients' parents have consented to participate this study and signed the informed consent form. The ethical number is SHERLL2021037 which was approved by the Ethics Committee of the Capital institute of Pediatric.

#### **Consent for publication**

Not Applicable.

#### Competing interests

There are no competing interests to declare for all authors.

Received: 6 May 2022 Accepted: 2 March 2023 Published online: 06 May 2023

#### References

- Kaddourah A, Basu RK, Bagshaw SM, et al. Epidemiology of acute kidney injury in critically ill children and Young adults. N Engl J Med. 2017;376(1):11–20. https://doi.org/10.1056/NEJMoa1611391.
- Dalfino L, Puntillo F, Ondok MJ, et al. Colistin-associated acute kidney injury in severely ill patients: a step toward a better renal care? A prospective cohort study. Clin Infect Dis. 2015;61(12):1771–7. https://doi.org/10. 1093/cid/civ717.
- Vilander LM, Kaunisto MA, Vaara ST, et al. Genetic variants in SERPINA4 and SERPINA5, but not BCL2 and SIK3 are associated with acute kidney injury in critically ill patients with septic shock. Crit Care. 2017;21(1):47. https://doi.org/10.1186/s13054-017-1631-3.
- Katayama S, Nunomiya S, Koyama K, et al. Markers of acute kidney injury in patients with sepsis: the role of soluble thrombomodulin. Crit Care. 2017;21(1):229. https://doi.org/10.1186/s13054-017-1815-x.
- Morreale M, Mulè G, Ferrante A, et al. Association of Renal Resistive Index with markers of Extrarenal vascular changes in patients with systemic lupus erythematosus. Ultrasound Med Biol. 2016;42(5):1103–10. https:// doi.org/10.1016/j.ultrasmedbio.2015.12.025.
- Brouwers JJ, van Wissen RC, Veger HT, et al. The use of intrarenal Doppler ultrasonography as predictor for positive outcome after renal artery revascularization. Vascular. 2017;25(1):63–73. https://doi.org/10.1177/ 1708538116644871.
- Seiler S, Colbus SM, Lucisano G, et al. Ultrasound renal resistive index is not an organ-specific predictor of allograft outcome. Nephrol Dial Transplant. 2012;27(8):3315–20. https://doi.org/10.1093/ndt/gfr805.
- Li X, Qiu L, Xu HD, et al. The application of percutaneous renal oxygen saturation and abdominal local oxygen saturation in infants undergoing cardiac surgery. Chin J Appl Clin Pediatr. 2021;36(01):28–32. https://doi. org/10.3760/cma.j.cn101070-20191030-01063.
- Saito J, Takekawa D, Kawaguchi J, et al. Preoperative cerebral and renal oxygen saturation and clinical outcomes in pediatric patients with congenital heart disease. J Clin Monit Comput. 2019;33(6):1015–22. https:// doi.org/10.1007/s10877-019-00260-9.
- Xie F, Liao HY, Ou YC, et al. Variation of end-tidal carbon dioxide partial pressure on regional renal oxygen saturation during anesthesia induction in infants undergoing ventricular septal defect repair. J Cardiovasc Pulmon Diseases. 2019;038(007):761–5. https://doi.org/10.3969/j.issn. 1007-5062.2019.07.011.
- Xu X, Nie S, Liu Z, et al. Epidemiology and clinical correlates of AKI in Chinese hospitalized adults. Clin J Am Soc Nephrol. 2015;9(10):1510. https:// doi.org/10.2215/CJN.02140215.

- Kang LK, Li XY, Zhang Q, et al. Advances in pathogenesis and novel biomarkers of sepsis associated acute kidney injury. J Pract Med. 2021;37(6):705–8. https://doi.org/10.3969/j.issn.1006-5725.2021.06.002.
- Sarkar S, Askenazi DJ, Jordan BK, et al. Relationship between acute kidney injury and brain MRI findings in asphyxiated newborns after therapeutic hypothermia. Pediatr Res. 2014;75(3):431–5. https://doi.org/10.1038/pr. 2013.230.
- Prowle JR, Kirwan CJ, Bellomo R. Fluid management for the prevention and attenuation of acute kidney injury. Nat Rev Nephrol. 2014;10(1):37– 47. https://doi.org/10.1038/nrneph.2013.232.
- Rozemeijer S, Haitsma Mulier JLG, Röttgering JG, et al. Renal resistive index: response to shock and its determinants in critically ill patients. Shock. 2019;52(1):43–51. https://doi.org/10.1097/shk.000000000001246.
- Zhao P, Liu X, Meng XA, et al. Role of renal arterial resistance index in patients with sepsis complicated with acute kidney injury. J Hunan Normal Univ (Medical Science). 2018;15(03):116–9. https://doi.org/10.3969/j. issn.1673-016X.2018.03.035.
- 17. Evans RG, Smith JA, Wright C, et al. Urinary oxygen tension: a clinical window on the health of the renal medulla? Am J Phys Regul Integr Comp Phys. 2014;306(1):R45–50. https://doi.org/10.1152/ajpregu.00437.2013.
- Yu C, Liu DW, Wang XT, et al. The clinical significance of microcirculation and oxygen metabolism evaluation in acute kidney injury assessment in patients with septic shock after resuscitation. Chin J Intern Med. 2018;57(2):123–8. https://doi.org/10.3760/cma.j.issn.0578-1426.2018.02. 008.
- Walker JL, Young HA, Lawson DS, et al. Optimizing venous drainage using an ultrasonic flow probe on the venous line. J Extra Corpor Technol. 2011;43(3):157–61.
- Bonsante F, Ramful D, Binquet C, et al. Low renal oxygen saturation at near-infrared spectroscopy on the first day of life is associated with developing acute kidney injury in very preterm infants. Neonatology. 2019;115(3):198–204. https://doi.org/10.1159/000494462.
- Liu LX, Huo Y, Wang X, et al. Accuracy of color Doppler in predicting acute kidney injury. Chin J Anesthesiol. 2018;038(008):989–91. https://doi.org/ 10.3760/cma.j.issn.0254-1416.2018.08.024.
- 22. Harer MW, Chock VY. Renal tissue oxygenation monitoring-an opportunity to improve kidney outcomes in the vulnerable neonatal population. Front Pediatr. 2020;8:241. https://doi.org/10.3389/fped.2020.00241.
- Gomez H, Ince C, De Backer D, et al. A unified theory of sepsis-induced acute kidney injury: inflammation, microcirculatory dysfunction, bioenergetics, and the tubular cell adaptation to injury. Shock. 2014;41(1):3–11. https://doi.org/10.1097/shk.00000000000052.
- Choi ME. Autophagy in kidney disease. Annu Rev Physiol. 2020;82:297– 322. https://doi.org/10.1146/annurev-physiol-021119-034658.
- Xing ZQ, Liu DW, Wang XT, et al. The value of renal resistance index and urine oxygen pressure for prediction of acute kidney injury in patients with septic shock. Chin J Intern Med. 2019;58(005):349–54. https://doi. org/10.3760/cma.j.issn.0578-1426.2019.05.004.
- Zhang Y. Perioperative near-infrared spectrophotometry monitoring in pediatric cardiac surgery. Chin J Extracorporeal Cir. 2021;1(19):56–60. https://doi.org/10.13498/j.cnki.chin.j.ecc.2021.0.

#### **Publisher's Note**

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.