# Cut-Off Value of Capillary Refill Time for Peripheral Circulatory Failure Diagnosis

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Keywords: capillary refill time; cut-off value; measurement device; occlusion test; peripheral circulatory failure

## Abbreviations:

AOT: artery occlusion test CRT: capillary refill time MAD: median absolute deviation No OT: no occlusion test ROC: receiver operating characteristic rSO<sub>2</sub>: local oxygen saturation VOT: venous occlusion test

## Abstract

**Introduction:** Capillary refill time (CRT) is an indicator of peripheral circulation and is recommended in the 2021 guidelines for treating and managing sepsis.

**Study Objective:** This study developed a portable device to realize objective CRT measurement. Assuming that peripheral blood flow obstruction by the artery occlusion test (AOT) or venous occlusion test (VOT) increases the CRT, the cut-off value for peripheral circulatory failure was studied by performing a comparative analysis with CRT with no occlusion test (No OT).

**Methods:** Fourteen (14) healthy adults (age: 20–26 years) participated in the study. For the vascular occlusion test, a sphygmomanometer was placed on the left upper arm of the participant in the supine position, and a pressure of 30mmHg higher than the systolic pressure was applied for AOT, a pressure of 60mmHg was applied for VOT, respectively, and no pressure was applied for No OT. The CRT was measured from the index finger of the participant's left hand.

**Results:** Experimental results revealed that CRT was significantly longer in the AOT and did not differ significantly in the VOT. The cut-off value for peripheral circulatory failure was found to be 2.88 seconds based on Youden's index by using receiver operating characteristic (ROC) analysis with AOT as positive and No OT as negative.

**Conclusion:** Significant results were obtained in a previous study on the evaluation of septic shock patients when CRT > three seconds was considered abnormal, and the cut-off value for peripheral circulatory failure in the current study validated this.

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## Introduction

Capillary refill time (CRT) is a measure of peripheral circulation and is recommended in the 2021 guidelines for treating and managing sepsis.<sup>1</sup> Past study examined the optimal strength and time of nail bed pressing to realize objective CRT measurement.<sup>2</sup> In addition, it experimentally demonstrated that the feedback function of the optimal measurement conditions is essential to meet the optimal measurement conditions with manual compression.<sup>3</sup> The study in the past developed a portable CRT measurement device with a feedback function and demonstrated that the measured values were more stable than conventional visual CRT measurements.<sup>4</sup> To evaluate the effect of vascular occlusion on the CRT and the cut-off value for peripheral circulatory failure, this study induced peripheral circulatory failure by performing vascular occlusion tests, because the artery occlusion test (AOT) and venous occlusion test (VOT) result in the occlusion of peripheral blood flow and prolongation of CRT.

This study hypothesized that the cut-off value for peripheral circulatory failure can be obtained using CRT values measured with AOT and VOT as positive and with no occlusion test (No OT) as negative and tested this hypothesis.

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Median Systolic Blood Pressure (mmHg)	Left Upper Arm	Confidence Intervals	Right Upper Arm	Confidence Intervals
Participant 1	98		106	
Participant 2	109		103	
Participant 3	107		106	
Participant 4	127		125	
Participant 5	115		114	
Participant 6	111		109	
Participant 7	100		101	
Participant 8	118		108	
Participant 9	103		105	
Participant 10	89		92	
Participant 11	101		109	
Participant 12	107		105	
Participant 13	93		96	
Participant 14	109		110	
Mean	106 (10.0)	112 to 100	106 (7.8)	111 to 102

Table 1. Median Systolic Blood Pressure of the Study Participants

## Methods

#### Study Design

The Institutional Review Board of Chiba University Graduate School of Medicine (Chiba, Japan) approved this experimental study (approval number: 4154). Written informed consent was obtained from all the participants. Fourteen (14) healthy adults (eight males and six females; age: 20–26 years) participated in this study. Excluded were individuals with underlying medical conditions or those taking medication. Blood pressure was measured thrice from both arms of the participants by using a sphygmomanometer (ES-W1200ZZ, Terumo Corp.; Tokyo, Japan), and the median systolic blood pressure of both arms was confirmed to be 10mmHg or less (Table 1).<sup>5</sup> Systolic blood pressure was employed as the reference value for the vascular occlusion test and was the median of the blood pressure measured thrice from the left arm.

## Hampel Filter

The CRT in this study is calculated according to the definition from the time series data of nail bed color measured by the color sensor (Figure 1).<sup>2,4</sup> The developed device is manually operated to release, which may introduce spike noise into the time series data of the nail bed color. A Hampel filter was used to compensate for spike noise.<sup>6</sup> The Hampel filter is a movingwindow implementation of the Hampel identifier proposed by Davies and Gather. It is a digital filter that corrects spike noise in the time series data by replacing it with the median value in the local window. The Hampel filter response can be expressed using Eq. (1):

$$y_{k} = \begin{cases} x_{k} |x_{k} - m_{k}| \leq tS_{k}, \\ m_{k} |x_{k} - m_{k}| tS_{k} \end{cases},$$
(1)

$$m_k = \mathrm{median}\{x_{k-K}, \cdots, x_k, \cdots, x_{k+K}\}, \quad (2)$$

$$S_k = 1.4826 \times \text{median}_{j \in [-K, K]} \{ |x_{k-j} - m_k| \},$$
 (3)

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Figure 1. Definition of CRT in This Study.

Note: CRT was calculated by normalizing the green channel values of the color sensor after release by the maximum and minimum values and from the time difference between G10% and G90%.

Abbreviation: CRT, capillary refill time.

where k is the reference identifier of the input data,  $y_k$  is the output value of the Hampel filter,  $x_k$  is the input data being referenced,  $m_k$  is the median of the moving window data and can be obtained using Eq. (2), K is the half-width parameter of the local window, t is the threshold of tolerance limits, and  $S_k$  is the median absolute deviation (MAD) scale estimate obtained using Eq. (3). With a coefficient of 1.4826, the MAD scale estimate is an unbiased estimate of the standard deviation for Gaussian distributed data. In this study, the half-width parameter K was empirically set as four, and the tolerance limit threshold value t



Figure 2. Effect of Hampel Filter on Measurement Error Correction. Note: (a) Before Correction; (b) After Correction.



Figure 3. Definition of Recovery Rate of Nail Bed Color.

was set as three. When the recovery curve contained noise, the calculated CRT was shorter (Figure 2(a)); the correct CRT was calculated when the noise was corrected using the Hampel filter (Figure 2(b)).

Detection of Abnormal Waveforms by Recovery Rate of Nail Bed Color In this study, the abnormal waveform of the nail bed color recovery curve was determined from the recovery rate of nail bed color after pressure release. The recovery rate of nail bed color R can be expressed using Eq. (4):

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**Figure 4.** Histogram of Recovery Rate of Nail Bed Color as Measured using the Total Occlusion Test. Note: The bin width of the histogram is set at 5%.

$$R = \frac{G_{max} - G_{min}}{G_{max} - G_{base}} \times 100,$$
(4)

where  $G_{base}$  is the minimum value of the green channel of the color sensor during compression, and  $G_{max}$  and  $G_{min}$  are the maximum and minimum values of the green channel of the color sensor after compression release. If the nail bed color does not recover to  $G_{base}$ after pressure release, the recovery rate R is R100; if it recovers above  $G_{base}$ ,  $R \ge 100$  (Figure 3). A histogram of the recovery rate Rcalculated from the nail bed color recovery curves of 42 cases measured in this study was created, and the threshold of abnormal waveforms was automatically obtained using Otsu's method<sup>7</sup> (Figure 4). Otsu's method is mainly used for binarization in image processing and automatically determines the threshold that maximizes the degree of separation, which is the ratio of the between-class variance to the within-class variance of two classes. The threshold of abnormal waveforms was calculated as 85 by using Otsu's method. From the results of abnormal waveform

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Fingertip Temperature (°C)	No OT	Confidence Intervals	ΑΟΤ	Confidence Intervals	VOT	Confidence Intervals
Participant 1	20.9		22.6		20.3	
Participant 2	20.9		19.4		20.0	
Participant 3	23.9		23.7		23.8	
Participant 4	33.3		31.6		32.3	
Participant 5	26.3		24.9		23.7	
Participant 6	30.0		30.3		31.0	
Participant 7	31.0		29.2		29.1	
Participant 8	32.2		29.7		30.9	
Participant 9	29.2		25.3		28.6	
Participant 10	31.4		30.8		30.6	
Participant 11	30.6		30.0		30.6	
Participant 12	32.4		30.4		31.1	
Participant 13	29.0		28.4		28.0	
Participant 14	30.9		28.3		28.9	
Mean	28.7 (4.1)	31.1 to 26.3	27.5 (3.7)	29.6 to 25.4	27.8 (4.1)	30.2 to 25.4

Table 2. Fingertip Temperature of the Study Participants

Abbreviations: No OT, no occlusion test; AOT, artery occlusion test; VOT, venous occlusion test.

determination by recovery rate R, eight cases of recovery curves were eliminated as abnormal waveforms in AOT. No abnormal waveforms were found in the recovery curves measured by No OT and VOT.

# Correction of CRT by Fingertip Temperature

A scatter plot of fingertip temperatures (Table 2) and CRTs measured in each occlusion test is shown in Figure 5. Single regression analysis revealed that No OT and VOT CRT were associated with fingertip temperature (No OT: P < .001, regression coefficient: 0.27; AOT: P = .411, regression coefficient: 0.06; VOT: P = .002, regression coefficient: 0.17). The correction equation for CRT due to fingertip temperature obtained by single regression analysis is given by Eq. (5):

$$C' = C + \alpha \times (T - T'), \tag{5}$$

where *C* is the CRT before temperature correction, *C'* is the CRT after temperature correction, *T* is the fingertip temperature, *T'* is the average fingertip temperature in each occlusion test (No OT: 28.7°C; VOT: 27.8°C), and  $\alpha$  is the regression coefficient (No OT: 0.27; VOT: 0.17). The correction by fingertip temperature was applied only to the CRTs measured at No OT and VOT and not to CRTs measured at AOT.

## CRT Measurement Experiment

Participants rested in the supine position for ten minutes in a quiet, air-conditioned environment at a room temperature of 23°C–24°C before the start of the experiment. A pulse oximeter (OX-101, DRETEC Co. LTD; Saitama, Japan) was attached to the ring finger of the participant's left hand. Three types of vascular occlusion tests (AOT, VOT, and No OT) were performed by placing a sphygmomanometer (Aneroid sphygmomanometer II, SANKEI Co. LTD; Chiba, Japan) on the left upper arm of the participant. For the AOT, a pressure of 30mmHg higher than the systolic pressure was applied.<sup>5</sup> The device operator confirmed that the participants' oxygen saturation could not be measured using a pulse oximeter due to arterial occlusion caused by the AOT. For the

VOT, a pressure of 60mmHg was applied.<sup>8</sup> The operator confirmed that the pulse oximeter could measure the participants' oxygen saturation during the VOT. For the No OT, no pressure was applied. The AOT and VOT were performed for 120 seconds according to the maximum duration (119 seconds) required for the local oxygen saturation  $(rSO_2)$  of the skin over the thumb carpometacarpal joint on the dorsal side of the hand to decrease to 40%.<sup>5</sup> After 120 seconds, the CRT was measured once from the participant's left index finger by using the developed CRT measuring device with the cuff inflated. Because the CRT was measured with the vessels occluded, the measurement was not repeated to account for changes in the fingertip's condition. After performing CRT measurements, fingertip temperature was measured using a non-contact thermometer (DVM105, Velleman Group; Gavere, Belgium) from the skin above the distal interphalangeal joint on the nail side of the index finger of the participant's left hand. The interval between occlusion tests was ten minutes, and the order of trials was changed in six ways for each volunteer. The CRTs calculated from the recovery curves of 14 No OT, six AOT, and 14 VOT cases not detected by abnormal waveform detection and corrected for fingertip temperature were used for statistical analysis.

## Statistical Analysis

The measured data were analyzed using R 4.2.2 version (The R Project for Statistical Computing; Vienna, Austria)<sup>9</sup> and visualized using Tidyverse 1.3.2 version (Posit; Boston, Massachusetts USA).<sup>10</sup> Python 3.8.10 version (Python Software Foundation; Wilmington, Delaware USA),<sup>11</sup> Pandas 1.5.2 version (NumFOCUS; Austin, Texas USA),<sup>12</sup> and Matplotlib 3.6.2 version (NumFOCUS; Austin, Texas USA),<sup>12</sup> were used to visualize the recovery curves shown in Figure 1, Figure 2, and Figure 3. The CRTs calculated from the recovery curves of 14 No OT, six AOT, and 14 VOT cases not detected by abnormal waveform detection and corrected for fingertip temperature were used for statistical analysis. Median CRTs between No OT and AOT and No OT and VOT were compared using the Wilcoxon



Figure 5. Relationship between CRT Measured in Each Occlusion Test and Fingertip Temperature. Note: (a) No OT; (b) AOT; (c) VOT.

Abbreviations: CRT, capillary refill time; No OT, no occlusion test; AOT, artery occlusion test; VOT, venous occlusion test.

signed-rank test. The cut-off value of CRT was determined using Youden's index by drawing the receiver operating characteristic (ROC) curve<sup>13</sup> (sklearn 0.0.post1 version, NumFOCUS; Austin, Texas USA).<sup>12</sup> P < .05 was considered significant.

## Results

In each vascular occlusion test, the CRTs of the AOT and VOT were compared based on the CRT of No OT in the same participant (Figure 6). The CRT of AOT was longer than that of No OT in all cases where it was not detected as an abnormal waveform. The CRT of VOT was higher in six cases compared to that of No OT. Wilcoxon signed-rank test results revealed significantly higher median CRT for No OT and AOT and no significant difference in median CRT for No OT and VOT (No OT and AOT: P = .036; No OT and VOT: P = .59).

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(Figure 7). The CRT distribution for No OT and AOT was bimodal. The ROC curve was drawn with the CRT of AOT as positive for peripheral circulatory failure and the CRT of No OT as negative, and the cut-off value of CRT was obtained using Youden's index.<sup>13</sup> The resulting CRT cut-off value was 2.88 seconds. The classification performance was 1.00 for area under the curve, accuracy, sensitivity, and specificity.

A histogram of the CRTs measured at No OT and AOT was

created to evaluate the cut-off value for peripheral circulatory failure

## Discussion

Despite its limitations in terms of interobserver variability,<sup>14,15</sup> CRT provides excellent discrimination for shock outcomes when used alone or in combination with other laboratory findings. When patients in shock are evaluated, a CRT of more than three seconds often indicates



Figure 6. Comparison of CRT Measured in Each Occlusion Test in the Same Participant. Note: (a) AOT and No OT; (b) VOT and No OT

Abbreviations: CRT, capillary refill time; No OT, no occlusion test; AOT, artery occlusion test; VOT, venous occlusion test.



Shinozaki © 2023 Prehospital and Disaster Medicine Figure 7. Histogram of CRTs Measured by No OT and AOT.

Note: The solid line is the normal distribution curve of CRT for each measured vascular occlusion test.

Abbreviations: CRT, capillary refill time; No OT, no occlusion test; AOT, artery occlusion test.

worse clinical outcomes.<sup>16,17</sup> In addition, increased CRT after resuscitation with initial infusion is strongly associated with increased organ damage and mortality.<sup>16,18</sup> As such, CRT is recommended in the 2021 guidelines for treating and managing sepsis.<sup>1</sup> This study developed a portable CRT measurement device<sup>3,4</sup> and evaluated the

circulatory failure in the measurement device. The study hypothesized that CRT would be longer in AOT and VOT; however, CRT in AOT was significantly longer compared to CRT in No OT, and CRT in VOT was not significantly different from CRT in No OT. Thus, AOT blocks blood flow into the periphery, whereas VOT blocks blood outflow from the periphery, allowing the blood to flow into the periphery. Thus, it suggests that the impairment of inflow blood flow may significantly impact CRT in particular. While this study did not examine the effects of medical history such as agingrelated changes or diabetes, which can affect blood vessels and blood flow, these factors may influence CRT and caution is necessary when applying the results in clinical practice. In the detection of abnormal waveforms by using the recovery rate of nail bed color, eight AOT data samples were excluded as abnormal waveforms, whereas No OT and VOT data samples were detected as abnormal waveforms (Figure 3 and Figure 4). Therefore, because abnormal waveforms are detected only at AOT, peripheral circulatory status can be evaluated from the recovery curve of the nail bed color.

effect of vascular occlusion on CRT and the cut-off value of peripheral

The CRT cut-off value obtained using Youden's index was 2.88 seconds. Because the case in which AOT obstructed blood flow to the periphery for two minutes can be considered an experimental model of an abnormal state in which peripheral rSO<sub>2</sub> dropped to approximately 40%,<sup>5</sup> the cut-off value of peripheral circulatory failure of 2.88 seconds obtained in this study can be considered the threshold of an abnormal state. In the ANDROMEDA-SHOCK study of septic shock,<sup>19</sup> significant results were obtained when CRT exceeding three seconds measured by manual compression and visual observation was considered abnormal. Results in this study may be able to measure CRT in a peripheral circulation state similar to clinically significant shock state, as supported by the clinically significant outcomes shown in the ANDROMEDA-SHOCK study<sup>19</sup> that used a similar threshold to this study. However, it should be noted that the microcirculation of shock patients encountered in clinical practice may differ in pathophysiology

from arterial occlusion, which raises the possibility of a threshold value different from that used in this study.

#### Limitations

The study has several limitations. First, a small number of participants were included in this study. In addition, because only one individual operated the device, there is a possibility of bias in the measurement results. Moreover, since this study only measured CRT in healthy adults in their 20s, there is a possibility of age-related effects.<sup>20</sup> Future studies will expand the age range of the study participants and the number of people operating the device to further validate the results.

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## Conclusions

This study aimed to study the effect of vessel occlusion on CRT and the cut-off value for peripheral circulatory failure. The results of the experiment showed that arterial occlusion had a significant impact on CRT. Additionally, the cut-off value for the peripheral circulatory failure model created by arterial occlusion was 2.88 seconds. The study results apply only to healthy young adults because the study results were based on a subset of young adults. The wide-spread use of precise CRT measurement by using portable CRT measurement devices will contribute to simple and quantitative microcirculation monitoring in clinical settings.

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