

Potential Value of Electrocardiogram and Photoplethysmogram for Non-invasive Blood Pressure Estimation during Exercise

In cheol Jeong, and Joseph Finkelstein, *Member, IEEE*

Abstract— Blood pressure (BP) monitoring is required to ensure safety of home-based exercise in seniors. Pulse transit time (PTT) defined as the time it takes a pulse wave to travel between two arterial sites is considered to be inversely proportional to BP. Different approaches have been described to calculate PTT using photoplethysmogram (PPG) and electrocardiogram (ECG) however it is not clear which approach produces better BP estimates. The purpose of this study was to compare potential value of different approaches for calculating PTT and other derivatives of PPG and ECG described in the literature for assessing BP during exercise. Three calibration points were collected from five study participants at different levels of exertion on three different days. A high precision automated BP monitor was used to obtain reference BP. A correlation matrix between PPG/ECG derivatives and the reference BP values was analyzed. Based on the bivariate correlation analysis, PPG/ECG derivatives that demonstrated the most prominent association with reference BP were identified. The results of the study confirmed the value of individualized calibration for BP estimation using PTT and identified optimal means to derive it from PPG and ECG.

I. INTRODUCTION

One of the main challenges in implementing an optimal home-based exercise program in older adults and individuals with cardiovascular conditions is the requirement to ensure exercise safety [1]. A crucial component to achieve this requirement is the ability to monitor blood pressure (BP) during exercise continuously and generate alert when blood pressure exceeds certain thresholds or changes abruptly [2].

Use of automated blood pressure monitors for continuous blood pressure monitoring during exercise is limited due to inherent high noise to signal ratio affecting precision of automated blood pressure monitors. The utility of photoplethysmogram (PPG) in circulatory monitoring has been widely discussed [3-4]. Various approaches based on continuous registration of PPG and electrocardiogram (ECG) have been described for non-invasive cuff-less BP estimation [5-6].

Pulse transit time (PTT) defined as the time it takes a pulse wave to travel between two arterial sites is considered to be inversely proportional to BP [4-6]. Though the use of PTT for non-invasive BP estimation has been well described, different studies derived PTT from PPG and ECG using different approaches [5-8]. Currently, it is not clear which approach

produces better BP estimates. In addition, current solutions require expensive equipment [9] which makes it impractical for wide application at patient homes or they utilize equations obtained from population-based estimates [10] which may not be applicable to particular individuals with chronic cardiovascular conditions or various comorbidities in older adults.

In our previous study we introduced a practical low-cost solution for using PTT to estimate BP during exercise [11]. Our approach was based on obtaining 3 calibration points during different levels of exertion for each subject and utilizing the resulting individualized BP estimation equation for patient-specific monitoring of BP during home-based exercise [12].

Previously, we used a single approach to calculate PTT despite the fact that different approaches have been described. The purpose of this paper was to compare potential value of different approaches for calculating PTT and other derivatives of PPG and ECG described in the literature for assessing BP during exercise.

II. METHODS

A. System and Data Acquisition

Three calibration points were collected from five study participants including 3 female and 2 male adult volunteers: (1) during the rest, (2) after 5-min exercise with cycling speed of 1.5-miles/hour, and (3) after 5-min exercise with cycling speed of 2.5-miles/hour. The procedure was repeated at three separate days for each study participant.

During each visit, the subjects used a portable bicycle (Chattanooga Deluxe ExerciserTM, Chattanooga, USA) to reach two different BP levels within individual comfort zone, in addition to BP calibration during the initial resting period. Before a subject followed the experimental procedure, she/he was seated in comfortable chair, worn sensor equipment, and asked to rest for cardiovascular stabilization. Continuous monitoring of ECG and PPG was carried out at 1 kHz sampling rate with PTT being calculated in real time. Overall, the study protocol included three 45-min visits within a 2-week period. During each visit, three sequential BP calibration points were collected during different levels of exertion for each study participant.

At each calibration point, reference BP measurements were registered by an automatic oscillometric sphygmomanometer which is routinely used in clinical care (Carescape Dinamap V100, GE Healthcare, USA). The Carescape Dinamap V100 provides high-precision automated oscillometric measurement of systolic, diastolic and mean arterial pressure and pulse rate that has been clinically proven to be more accurate than competitive models [13-14].

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I. C. Jeong is with the Chronic Disease Informatics Program, Johns Hopkins University School of Medicine, Baltimore, Maryland, 21224, USA (e-mail: ijeong1@jhmi.edu).

J. Finkelstein is with the Chronic Disease Informatics Program, Johns Hopkins University School of Medicine, Baltimore, Maryland, 21224, USA (e-mail: jfinkel9@jhmi.edu).

TABLE II. MAXIMUM AND MINIMUM BIVARIATE CORRELATIONS FOR INDIVIDUAL PARTICIPANTS

Correlations		ECGRRRI																
PEAKRRI	MAX	1.000																
	MIN	1.000	PEAKRRI															
FOOTRRI	MAX	1.000	1.000															
	MIN	1.000	1.000	FOOTRRI														
SYST	MAX	0.969	0.969	0.968														
	MIN	0.681	0.678	0.687	SYST													
DIAT	MAX	0.995	0.996	0.995	0.938													
	MIN	0.983	0.984	0.982	0.537	DIAT												
PTTP	MAX	0.980	0.981	0.979	0.974	0.980												
	MIN	0.694	0.694	0.699	0.702	0.643	PTTP											
PTTM	MAX	0.980	0.981	0.980	0.964	0.982	0.995											
	MIN	0.668	0.668	0.667	0.342	0.622	0.789	PTTM										
PTTF	MAX	0.085	0.091	0.082	-0.018	0.175	0.584	0.579										
	MIN	-0.798	-0.799	-0.800	-0.911	-0.723	-0.793	-0.792	PTTF									
PTTF1	MAX	0.997	0.997	0.997	0.957	0.999	0.987	0.180										
	MIN	0.986	0.986	0.986	0.599	0.980	0.750	0.754	-0.748	PTTF1								
SYSA	MAX	0.791	0.790	0.791	0.738	0.835	0.655	0.556	-0.147	0.797								
	MIN	-0.281	-0.286	-0.279	-0.349	-0.335	-0.403	-0.371	-0.727	-0.348	SYSA							
DIAA	MAX	0.846	0.845	0.846	0.775	0.886	0.723	0.632	-0.167	0.853	0.992							
	MIN	0.439	0.436	0.441	0.119	0.391	-0.014	0.012	-0.587	0.377	0.732	DIAA						
SBP	MAX	-0.710	-0.710	-0.710	-0.628	-0.713	-0.653	-0.548	0.646	-0.776	0.366	-0.297						
	MIN	-0.924	-0.925	-0.924	-0.797	-0.920	-0.959	-0.966	-0.353	-0.938	-0.840	-0.844	SBP					
DBP	MAX	0.612	0.614	0.617	0.607	0.605	0.589	0.549	0.251	0.607	0.562	0.599	0.875					
	MIN	-0.721	-0.722	-0.720	-0.584	-0.740	-0.888	-0.826	-0.684	-0.745	-0.222	-0.555	-0.545	DBP				
MBP	MAX	-0.515	-0.515	-0.514	-0.423	-0.545	-0.361	-0.268	0.459	-0.503	0.335	-0.201	0.990	0.924				
	MIN	-0.911	-0.912	-0.911	-0.787	-0.919	-0.946	-0.957	-0.478	-0.927	-0.618	-0.591	0.823	0.012	MBP			
HR	MAX	-0.881	-0.881	-0.878	-0.506	-0.854	-0.543	-0.677	0.830	-0.921	0.211	-0.284	0.968	0.853	0.957			
	MIN	-0.970	-0.970	-0.971	-0.952	-0.953	-0.943	-0.942	-0.327	-0.960	-0.777	-0.806	0.699	-0.643	0.519	HR		
PP	MAX	-0.731	-0.732	-0.731	-0.548	-0.729	-0.704	-0.609	0.683	-0.792	0.404	-0.275	0.981	0.724	0.927	0.930		
	MIN	-0.926	-0.928	-0.926	-0.837	-0.924	-0.972	-0.966	-0.231	-0.936	-0.842	-0.858	0.946	-0.752	0.644	0.684	PP	

MAX: Maximum correlation in 5 participants, MIN: Minimum correlation in 5 participants

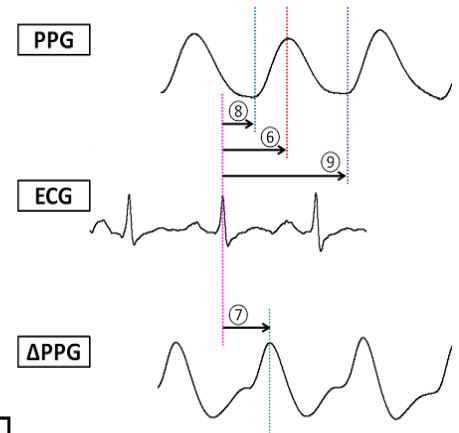


Figure 2. Parameters

TABLE III. MEAN AND MEDIAN BIVARIATE CORRELATIONS FOR ALL INDIVIDUAL PARTICIPANTS

MEDIAN	MEAN	Correlations															
	ECGRRRI	PEAKI	FOOTI	SYST	DIAT	PTTP	PTTM	PTTF	PTTF1	SYSA	DIAA	SBP	DBP	MBP	HR	PP	
ECGRRRI		1.000	1.000	0.881	0.991	0.850	0.827	-0.265	0.992	0.280	0.639	-0.845	-0.285	-0.758	-0.931	-0.845	
PEAKI	1.000		1.000	0.880	0.992	0.849	0.827	-0.263	0.992	0.278	0.637	-0.846	-0.285	-0.759	-0.931	-0.846	
FOOTI	1.000	1.000		0.882	0.991	0.851	0.826	-0.265	0.992	0.283	0.641	-0.845	-0.285	-0.758	-0.930	-0.845	
SYST	0.917	0.914	0.918		0.815	0.853	0.742	-0.450	0.848	0.303	0.573	-0.713	-0.213	-0.643	-0.804	-0.718	
DIAT	0.992	0.992	0.992	0.873		0.816	0.812	-0.203	0.991	0.279	0.643	-0.848	-0.286	-0.759	-0.927	-0.847	
PTTP	0.889	0.889	0.888	0.877	0.862		0.940	0.024	0.883	0.147	0.441	-0.823	-0.319	-0.744	-0.821	-0.817	
PTTM	0.781	0.783	0.779	0.791	0.815	0.967		0.110	0.870	0.007	0.340	-0.815	-0.320	-0.729	-0.827	-0.821	
PTTF	-0.096	-0.093	-0.100	-0.513	-0.015	0.209	0.202		-0.151	-0.449	-0.409	-0.050	-0.325	-0.089	0.175	-0.013	
PTTF1	0.994	0.994	0.994	0.877	0.991	0.922	0.858	0.065		0.248	0.611	-0.872	-0.313	-0.784	-0.935	-0.868	
SYSA	0.062	0.057	0.071	0.551	0.158	0.301	-0.213	-0.429	0.029		0.880	-0.140	0.140	-0.082	-0.222	-0.128	
DIAA	0.553	0.549	0.560	0.674	0.611	0.567	0.359	-0.468	0.511	0.847		-0.471	-0.074	-0.393	-0.569	-0.461	
SBP	-0.891	-0.891	-0.889	-0.692	-0.883	-0.852	-0.877	-0.203	-0.930	-0.061	-0.365		0.418	0.936	0.844	0.966	
DBP	-0.569	-0.569	-0.575	-0.537	-0.549	-0.424	-0.317	-0.252	-0.668	0.226	-0.134	0.691		0.640	0.404	0.220	
MBP	-0.832	-0.832	-0.833	-0.617	-0.813	-0.803	-0.856	-0.170	-0.883	-0.115	-0.319	0.955	0.883		0.797	0.828	
HR	-0.929	-0.929	-0.929	-0.861	-0.941	-0.887	-0.903	0.064	-0.930	-0.014	-0.514	0.849	0.774	0.922		0.797	
PP	-0.843	-0.844	-0.843	-0.740	-0.838	-0.778	-0.824	-0.176	-0.874	0.024	-0.409	0.967	0.419	0.896	0.841		

MEAN: Mean of correlations in 5 participants, MEDIAN: Median of correlations in 5 participants

LMA of the maximum acceleration point of PPG was applied. After ECG R peak, PPG peak, PPG foot, and the maximum acceleration point of PPG were identified, the parameters ① to ⑪ were calculated. The parameters ① to ⑨ were calculated as time intervals between the following points: ① - the present R peak and the next R peak; ② - the present PPG peak and the next PPG peak; ③ - the present PPG foot and the next PPG foot; ④ - the present PPG foot and the following PPG peak; ⑤ - the present PPG peak and the following PPG foot; ⑥ - the present R peak and the following PPG peak; ⑦ - the present R peak and the following maximum acceleration point of PPG; ⑧ - the present R peak and the following PPG foot; ⑨ - the present R peak and the

second PPG foot. The parameters ⑩ and ⑪ were calculated as the area under the PPG curve for ④ and ⑤ respectively. All parameters were calculated on a beat-by-beat basis as it is depicted in the Fig. 1 and Fig. 2.

All statistical analyses were performed using IBM SPSS Statistics 21 (IBM, USA). Bivariate correlation analyses for each of 45 parameters were conducted as shown in Table I. After the bivariate correlation coefficients were calculated for the entire data set (Table I), the correlation coefficients for each of 5 participants were calculated on an individual basis to find out how much the correlation coefficients differ from participant to participant. The ranges between maximum and minimum of correlation, and correlation coefficient mean and

median for each correlation pair are shown in the Table II and Table III.

III. RESULTS

The results from bivariate correlation analysis based on entire data set are given in the Table 1. Total of 15 values for each parameter were used to analyze the “population-based” relationship between PPG and ECG derivatives and readings from an automated BP monitor. For data obtained from the BP monitor, the maximum correlation was found to be between SBP and PP ($r=+0.903$, $p<0.01$), however correlation was low between SBP and DBP ($r=+0.385$, $p<0.01$) and between DBP and PP ($r=-0.048$, $p=0.752$). Based on comparing correlation coefficients between PPG/ECG derivatives and SBP and DBP obtained from an automated sphygmomanometer, the highest correlation coefficients were found between SBP and PTTP ($r=-0.809$, $p<0.01$) and between SBP and PTTM ($r=-0.793$, $p<0.01$).

The results from the correlational analysis on an individual basis are shown in the Tables II and III. In this analysis, total of 9 values for each parameter were used. Similar to the “population-based” analysis, the relationship between SBP and PP was significant (MAX: $r=+0.981$, MIN: $r=+0.946$, MEAN: $r=+0.966$, MEDIAN: $r=+0.967$), and there was no significant correlation between DBP and PP (MAX: $r=+0.724$, MIN: $r=-0.752$, MEAN: $r=+0.220$, MEDIAN: $r=+0.419$), and between SBP and DBP (MAX: $r=+0.875$, MIN: $r=-0.545$, MEAN: $r=+0.418$, MEDIAN: $r=+0.691$). Overall correlations between PPG/ECG derivatives and SBP/DBP from automated BP monitor resembled relationships found in the “population-based” analysis. The most prominent correlations were found again between SBP and PTTP (MAX: $r=-0.959$, MIN: $r=-0.653$, MEAN: $r=-0.823$, MEDIAN: $r=-0.852$) and between SBP and PTTM (MAX: $r=-0.966$, MIN: $r=-0.548$, MEAN: $r=-0.815$, MEDIAN: $r=-0.877$). However, for some study subjects, other PPG/ECG-derived indices, such as ECGRRI, PEAKI, and FOOTI, appeared to have better association with SBP than PTTP or PTTM (MAX: $r=-0.710$, MIN: $r=-0.924$ to -0.925 , MEAN: $r=-0.845$ to -0.846 , MEDIAN: $r=-0.889$ to -0.891). For some subjects DIAT demonstrated significant correlation with SBP (MAX: $r=-0.713$, MIN: $r=-0.920$, MEAN: $r=-0.848$, MEDIAN: $r=-0.883$), whereas in other subjects the best correlation with SBP was found to be with PTTF1 (MAX: $r=-0.776$, MIN: $r=-0.938$, MEAN: $r=-0.872$, MEDIAN: $r=-0.930$) in our study protocol.

IV. DISCUSSION

In this study, analysis of bivariate correlations between the most common PPG/ECG derivatives and SBP/DBP obtained during exercise from an automated precision BP monitor has been performed. Based on the “population-based” analysis from the pulled dataset, the most prominent association was found between SBP and PTTM ($r=-0.793$, $p<0.01$). These results correspond well with previously reported data [9-11]. However, correlation analysis on a participant-by-participant basis demonstrated a wide range in the strength of association between SBP and PTTM, with other associations appearing to

be more prominent. This result was confirmed by a recent study [15] that showed dependence of PTT and BP association on the underlying health condition.

In our previous study [11], we demonstrated that an individual calibration based on different levels of exertion results in more reliable estimation of BP. The results of this study appear to indicate that the very choice of PPG/ECG derivatives used for the individual calibration should be also tailored to each particular patient based on results of bivariate correlation analysis. Whether this approach can improve estimation of BP during exercise using PPG/ECG derivatives remain to be shown.

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