# Age-Specific Approach to Arterial Stiffness Prediction in Apparently Healthy Patients

Anna Bragina<sup>a, [b](https://orcid.org/0000-0001-8397-0210)</sup> , Yulia Rodionova<sup>a, b</sup> , Natalia Druzhinina<sup>a, b</sup> , Timur Gamilov<sup>b, c, [d](https://orcid.org/0009-0004-4575-4348)</sup>.[,](https://orcid.org/0009-0000-1610-2034) Ekaterina Udalova<sup>d</sup> , Artem Rogov<sup>b, c</sup>. Lubov Vasileva<sup>a[,](https://orcid.org/0000-0002-5296-8924) g</sup> , Rustam Shikhmagom[e](https://orcid.org/0000-0002-9806-6213)dov<sup>a</sup> , Oksana Avdeenko<sup>e</sup> , Anna Kazadaeva<sup>f</sup> [,](https://orcid.org/0000-0001-7294-6418) Kirill Novikov<sup>[a](https://orcid.org/0000-0002-0758-5609)</sup> , Valeriy Podzolkov<sup>a</sup>

#### **Abstract**

**Background:** The high prevalence of traditional cardiovascular risk factors among the patients without cardiovascular disease (CVD) allows us to predict an increase in cardiovascular morbidity rate in the future. Arterial stiffness is one of the most important predictors and pathogenetic mechanisms of CVD development. The aim of our study was to evaluate the predictive differences of age-related and age-independent (universal) cardio-ankle vascular index (CAVI) reference values for detecting increased arterial stiffness in individuals without CVD.

**Methods:** The study included 600 patients (43% men and 57% women, mean age  $36.0 \pm 18.3$  years). All the patients underwent anthropometric measurements with obesity markers evaluation, assessment of arterial stiffness by sphygmomanometry. To create predictive models, we used universal and age-related CAVI thresholds:  $\geq 9.0$  (CAVI<sup> $\geq 9$ </sup>) and CAVI<sup>Age</sup> according to the "Consensus of Russian experts on the evaluation of arterial stiffness in clinical practice".

**Results:** In the < 50 years group, both the CAVI<sup>Age</sup> and CAVI<sup>2 9</sup> models were significant (CAVI<sup>Age</sup>:  $b = 4.8$ , standard error b (st.err.b)

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a Department of Internal Medicine No. 2, Institute of Clinical Medicine, Sechenov First Moscow State Medical University, 19991 Moscow, Russia bWorld-Class Research Center "Digital Biodesign and Personalized Healthcare", Sechenov First Moscow State Medical University, 19991 Moscow, Russia

c Moscow Institute of Physics and Technology, 141701 Dolgoprudny, Russia dDepartment of Mathematical Modelling of Processes and Materials, Sirius University of Science and Technology, 354340 Sochi, Russia

e Department of Therapeutic Dentistry, Institute of Dentistry Named After E.V. Borovsky, Sechenov First Moscow State Medical University, 19991 Moscow, Russia

<sup>f</sup>Medical Center Doctor Aleksandrovsky, Medgroup Fantasy Children's Clinic, Ltd. 121059 Moscow, Russia

gCorresponding Author: Lubov Vasileva, Department of Internal Medicine No. 2, Institute of Clinical Medicine, Sechenov First Moscow State Medical University, Moscow, Russian. Email: vasileva\_l\_v\_2@staff.sechenov.ru

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 $= 0.27$ ,  $P < 0.001$ ; CAVI<sup>2 9</sup>:  $b = 3.2$ , st.err.b = 1.6,  $P < 0.001$ ). The CAVI<sup>Age</sup> model demonstrated high sensitivity and specificity ( $> 70\%$ ) compared to the CAVI≥ 9 model (sensitivity 62%, specificity 58%). In the receiver operating characteristic (ROC) curve analysis, the CAVIAge model had a significantly higher area under the ROC curve (AUC) = 0.802 than the CAVI<sup>≥ 9</sup> model: AUC = 0.674. In the  $\geq$  50 years group, both models were significant: CAVI<sup>Age</sup> ( $b = 2.6$ , st.err.b  $= 1.13$ , P < 0.001) and CAVI<sup>2 9</sup> (b = 5.3, st.err.b = 0.94, P < 0.001). Both models demonstrated high sensitivity and specificity (> 70%). When ROC curves were analyzed for the CAVIAge model, the AUC value of 0.675 was significantly lower when compared to the CAVI<sup>≥</sup>  $9 \text{ model (AUC} = 0.787, P = 0.031).$ 

**Conclusions:** In the < 50 years group, the model based on age-specific CAVI thresholds has the higher predictive value, sensitivity, and specificity for identifying individuals with increased arterial stiffness. In contrast, in the  $\geq$  50 years group, a predictive model using a universal threshold value of CAVI<sup>≥ 9</sup> has advantages.

**Keywords:** Arterial stiffness; Cardio-ankle vascular index; Predictive model; Metabolic parameters

#### **Introduction**

According to the Non-Communicable Diseases (NCD) Risk Factor Collaboration, which included information from 104 million individuals from 200 countries, the prevalence of essential hypertension (EH) has doubled over the past 20 years among those aged 30 - 79 years [1]. According to the Russian multicenter epidemiological study ESSE-RF2 (epidemiology of cardiovascular diseases in the regions of the Russian Federation, the second study) (2017), the incidence of EH at the age of 25 - 34 years is 25.5% in men and 11.3% in women, dyslipidemia/obesity - 32.9/14.3% and 38.8/10.7%, respectively, and increases in the following decades of life [2-4].

The high prevalence of traditional cardiovascular risk factors among the patients without cardiovascular disease (CVD) allows us to predict an increase in cardiovascular morbidity rate in the future. The Global Burden of Disease, Injuries, and Risk Factors Study (GBD) confirmed this trend through demonstrating CVD prevalence in patients aged 15 - 39 years in-

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creased by 0.38% annually, 0.08% of which was due to hypertension and ischemic heart disease (IHD) (data analyzed from 1990 to 2019) [5].

Therefore, CVD prediction at early preclinical stages is essential. Risk assessment scales such as Systematic Coronary Risk Evaluation 2 (SCORE2) and Framingham Risk Score are widely used to predict 10-year fatal and nonfatal cardiovascular risk [6, 7]. But there are some limitations: Framingham Risk Score (2008) is validated only for the US population (European Americans and African Americans aged 30 - 79 years) [6]; SCORE2 scale enables us to assess cardiovascular risk only for people aged 40 - 69 years [7]. Thus, younger patients are outside the ranges of the prognostic scales.

Arterial stiffness is one of the most important predictors and pathogenetic mechanisms of CVD development [8]. ENIGMA (enhancing neuroimaging genetics through metaanalysis) study (which includes 1,028 healthy students aged 17 - 27 years) revealed that arterial stiffness is an essential hemodynamic disturbance underlying hypertension [9].

A gradual increase in arterial stiffness is noted with increasing age, which is known as healthy vascular aging (HVA) [10]. Other patterns include supernormal vascular aging (SU-PERNOVA), when patients have low arterial stiffness even in old age, and early vascular aging (EVA), characterized by the early development of increased arterial stiffness [10, 11].

Measurement of cardio-ankle vascular index (CAVI) with sphygmomanometry is one of the basic and accurate methods to assess arterial stiffness [8, 12, 13]. Based on the study of Tanaka et al, the level of CAVI  $\geq$  9.0 is generally accepted as the criterion of increased arterial stiffness [12]. In 2016, the Russian researchers also proposed age-specific CAVI thresholds ranging from  $> 7.2$  in patients aged 21 - 30 years to  $> 9.8$ in patients over 70 years [14]. Applying the universal threshold value can be associated with underestimation of arterial stiffness level in young and middle-aged individuals. To date, there are many approaches using different CAVI thresholds at different age groups, but no comparison of these models has been performed [14].

Therefore, the aim of our study was to evaluate the predictive differences of age-related and age-independent (universal) CAVI reference values for detecting increased arterial stiffness in individuals without CVD.

## **Materials and Methods**

This study was conducted in accordance with the principles of the Declaration of Helsinki and was approved by Sechenov University Local Ethic Committee (protocol No. 25-22, dated December 8, 2022). All patients provided written informed consent prior to enrollment.

We included 600 patients (43% men and 57% women, mean age  $36.0 \pm 18.3$  years) who passed annual clinical examination in the University Clinical Hospital No. 4 of Sechenov University.

The inclusion criteria were apparently healthy adults  $\geq 18$ years of age, with written informed consent prior to enrollment and mental and physical ability to participate in the study. Exclusion criteria were: stage 3 hypertension, atherosclerosis obliterans of lower limb arteries, IHD, cerebrovascular disease, impaired liver function, glomerular filtration rate (GFR)  $<$  30 mL/min/1.73m<sup>2</sup>, proteinuria  $\geq$  300 mg/day, type 1 and 2 diabetes mellitus, any chronic inflammatory disease, pregnancy and conditions limiting arterial stiffness assessment by sphygmomanometry (atrial fibrillation, aortic valve disease, bronchial asthma and chronic obstructive pulmonary disease exacerbation).

All the patients underwent anthropometric measurements with obesity markers evaluation: waist circumference (WC) and body mass index (BMI) [15]. Lipid profile (total cholesterol (TC), low-density lipoprotein (LDL), high-density lipoprotein (HDL), and triglyceride (TG)), glucose and creatinine levels were assessed by CardioChek PA (USA, 2017) express analyzer. Then lipid accumulation product (LAP) [16], visceral adiposity index (VAI) [17], body fat percentage (BFP) [18] indices were calculated. Impaired glucose tolerance (IGT) was determined by history taking and medical records according to the American Association of Clinical Endocrinology Consensus Statement: Comprehensive Type 2 Diabetes Management Algorithm - 2023 Update [19].

Stage and grade of hypertension were defined in accordance with the European Society of Cardiology 2023 guidelines [20]. Presence of dyslipidemia and abdominal obesity were assessed according to the Russian Society of Cardiology 2020 guidelines [15].

Arterial stiffness was obtained by sphygmomanometry on VaSera VS-1000 Fukuda Denshi scanner (Japan, 2010). All participants were given instructions prior to the measurements: the procedure was conducted in a supine position, in the morning, participants should be abstained from alcohol, caffeine, and smoking for 8 h prior to the measurement.

To create predictive models, we used universal and agerelated CAVI thresholds:  $\geq$  9.0 (CAVI<sup> $\geq$ 9</sup>) [12] and CAVI<sup>Age</sup> according to the "Consensus of Russian experts on the evaluation of arterial stiffness in clinical practice" (2016) [14]. The median reference values of CAVI  $\geq$  7.2 at the age of 21 to 30 years; CAVI  $\geq$  7.4 at the age of 31 to 40 years; CAVI  $\geq$  7.55 at the age of 41 to 50 years and CAVI  $\geq$  8.0 at the age of 51 to 60 years, and CAVI  $\geq$  9.8 at the age of over 70 years were used as CAVIAge thresholds [14].

All statistical analysis was performed with Statistica 12.0. For each pair of variables, including binomial variables (age, weight, hypertension, etc.), the Spearman correlation coefficient was calculated. Random Forest machine learning method was used to identify the significance of risk factors. Factors that demonstrated significance (variable rank  $\geq 70$ and importance  $\geq 0.7$ ) were included in further statistical analysis. We used the patient database to develop a machine learning algorithm that estimates the likelihood of developing arterial stiffness. We used logistic regression because it is able to handle different types of input variables (continuous, categorical) and can be used to obtain a clear formula to estimate the probability. We calculated the specificity, sensitivity and mixing matrix of the developed algorithm. The area under the receiver operating characteristic (ROC) curve (AUC) was also estimated. The results were considered significant when  $P < 0.05$ .

Parameter	All $(n = 600)$	Age $\leq 50$ (n = 378)	$Age \ge 50 (n = 222)$	P value for age, $\leq 50$ vs. $\geq 50$
Age, years	$39.8 \pm 18.3$	$28.78 \pm 10.4$	$60.9 \pm 7.5$	${}< 0.001$
Men, $\%$	43.17	42.28	40.09	0.88
Weight, kg	$77.09 \pm 19.14$	$72.9 \pm 19.2$	$85.4 \pm 16.4$	0.02
BMI, $\text{kg/m}^2$	$29.29 \pm 7.3$	$28.87 \pm 8.7$	$29.98 \pm 5.2$	0.85
WC, cm	$80.79 \pm 15.51$	$78.55 \pm 14.01$	$91.9 \pm 17.2$	0.022
Hypertension, %	32.67	11.94	66.67	0.001
SBP, mm Hg	$128.4 \pm 15.33$	$125.8 \pm 12.87$	$132.9 \pm 17.6$	$\leq 0.001$
DBP, $mm$ $Hg$	$79.19 \pm 9.32$	$78.08 \pm 8.58$	$81.5 \pm 10.2$	0.032
TC, mmol/L	$4.8 \pm 1.20$	$4.49 \pm 0.89$	$5.47 \pm 1.45$	${}< 0.001$
LDL, mmol/L	$2.85 \pm 1.26$	$2.46 \pm 1.01$	$3.64 \pm 1.28$	< 0.001
HDL, mmol/L	$1.37 \pm 0.4$	$1.4 \pm 0.45$	$1.29 \pm 0.42$	0.08
TG, mmol/L	$1.82 \pm 1.18$	$1.8 \pm 1.15$	$1.9 \pm 1.16$	0.28
Glucose, mmol/L	$5.30 \pm 1.89$	$4.85 \pm 1.1$	$6.2 \pm 2.78$	${}_{0.001}$
Creatinine, µmol/L	$84.13 \pm 18.06$	$79.86 \pm 14.95$	$92.03 \pm 20.45$	${}< 0.001$
GFR, $mL/min/1.73$ $m2$	$97.5 \pm 22.87$	$97.6 \pm 18.56$	$68.1 \pm 16.5$	${}< 0.001$
LAP	$41.28 \pm 34.2$	$34.87 \pm 34.1$	$54.1 \pm 31.2$	${}< 0.001$
VAI	$1.99 \pm 1.13$	$1.8 \pm 1.05$	$2.3 \pm 1.16$	0.002
<b>BFP</b>	$34.38 \pm 8.6$	$31.3 \pm 10.4$	$40.3 \pm 8.3$	${}< 0.001$
High CAVIAge, %	29.7	19.04	47.7	${}< 0.001$
High CAVI <sup><math>\geq 9</math></sup> , %	16.3	3.97	37.4	$< 0.001$

**Table 1.** Clinical and Demographic Characteristics of Participants

BMI: body mass index; WC: waist circumference; HC: hip circumference; SBP: systolic blood pressure; DBP: diastolic blood pressure; TC: total cholesterol; LDL: low-density lipoprotein; HDL: high-density lipoprotein; TG: triglycerides; GFR: glomerular filtration rate; LAP: lipid accumulation product; VAI: visceral adiposity index; BFP: body fat percentage; CAVIAge: patients with high arterial stiffness formed according to age-specific cardio-ankle vascular index reference values; CAVI<sup>≥ 9</sup>: patients with high arterial stiffness formed according to universal cardio-ankle vascular index reference values.

## **Results**

Clinical and demographic characteristics of the patients are shown in Table 1. The incidence of hypertension, obesity and dyslipidemia was consistent with population-based rates. All patients ( $n = 600$ ) were divided into two groups according to the age:  $50$  (n = 378) and  $\geq 50$  years (n = 222).

In the  $\geq$  50 years group there was a significantly higher incidence of overweight individuals with elevated anthropometric and metabolic parameters (WC, TC, LDL, glucose, LAP, VAI, BFP), hypertension (and corresponding systolic blood pressure (SBP) and diastolic blood pressure (DBP) levels), higher creatinine concentrations and lower GFR. In the  $\geq$  50 years group, individuals with high arterial stiffness, defined by both the universal CAVI<sup>≥9</sup> and CAVI<sup>Age</sup> thresholds, were significantly more common. However, individuals with high arterial stiffness identified by CAVI<sup>Age</sup> were significantly more common in the  $\leq 50$ years group than in the CAVI<sup>≥ 9</sup> group ( $\chi^2$ = 11.054, P < 0.001). In the older group, differences in the frequencies of increased stiffness detected according to CAVI<sup>Age</sup> and CAVI<sup>≥ 9</sup> criteria were not significant ( $\chi^2$  = 2.476, P = 0.116).

The frequency of patients with increased arterial stiffness according to the CAVI<sup>Age</sup> or CAVI<sup>≥ 9</sup> in different age groups is

shown in Figure 1. When CAVIAge was used, arterial stiffness was detected significantly more often in younger age groups (P  $< 0.05$ ) compared to CAVI<sup>≥ 9</sup>. Conversely, CAVI<sup>≥ 9</sup> identified more patients with increased arterial stiffness in  $> 70$  years group ( $P < 0.05$ ) (Fig. 1).

Single-factor correlation analysis was performed in the < 50 years (Fig. 2) and  $\geq 50$  years (Fig. 3) groups to determine the correlation between risk factors and CAVI values. The results are presented in correlation matrices. In the < 50 years group, there were significant positive correlations with varying strength between variables of CAVI and variables of age, DBP, LDL, LAP, VAI, and negative correlations between CAVI and GFR (Fig. 2).

In  $\geq$  50 years group (Fig. 3), we revealed significant positive correlation with varying strength between variables of CAVI and variables of age, presence of hypertension, SBP, dyslipidemia, IGT, TC and glucose level. Factors most associated with CAVI levels in correlation analysis of the < 50 and ≥ 50 years groups were analyzed by Random Forest machine learning using CAVI<sup>Age</sup> and CAVI<sup>≥ 9</sup> thresholds.

In the  $<$  50 years group, age (variable rank  $=$  100, importance = 1.0) and LDL level (variable rank = 79.5, importance = 0.795) played a significant role in the CAVI<sup>Age</sup> model (Fig. 4).

For the CAVI<sup>≥ 9</sup> model, age (variable rank = 100, importance = 1.0) was also the most significant factor, and LDL level



**Figure 1.** Age distribution of patients with elevated CAVI. CAVI: cardio-ankle vascular index.

(variable rank = 72, importance =  $0.72$ ) was highly significant (Fig. 5).

In the  $\geq 50$  years group, SBP level (variable rank = 100, importance  $= 1.0$ ) played a fundamental role in the CAVI<sup>Age</sup> model, glucose level (variable rank =  $99.5$ , importance = 0.995), TC (variable rank = 91, importance =  $0.91$ ), age (variable rank = 79, importance  $= 0.79$ ) and hypertension duration (variable rank  $= 72$ , importance  $= 0.72$ ) were highly significant (Fig. 6).

Age was the most significant factor (variable rank  $= 100$ , importance = 1.0) in the CAVI<sup>≥ 9</sup> model, SBP (variable rank  $= 92$ , importance  $= 0.92$ ), TC (variable rank  $= 85$ , importance  $= 0.85$ ) and glucose level (variable rank  $= 83$ , importance  $=$ 0.83) were somewhat less important, hypertension duration (variable rank  $= 69$ , importance  $= 0.69$ ) and other factors were less significant (Fig. 7).

Factors with the highest significance in the Random Forest analysis were included in a multivariate analysis and predictive model formation to detect increased arterial stiffness using CAVI<sup>Age</sup> and CAVI<sup>≥ 9</sup> in the < 50 and ≥ 50 years groups.

In the < 50 years group, age and LDL levels were included in the increased arterial stiffness predictive model (CAVIAge and CAVI<sup>≥9</sup>). Both the CAVI<sup>Age</sup> and CAVI<sup>≥9</sup> models were significant (CAVI<sup>Age</sup>:  $b = 4.8$ , standard error b (st.err.b) = 0.27, P < 0.001; CAVI<sup> $\geq$ 9</sup>: b = 3.2, st.err.b = 1.6, P < 0.001). Within these models, age had the highest independent association with CAVI value (CAVI<sup>Age</sup>:  $b = 2.1$ , st.err. $b = 1.04$ ,  $P < 0.001$ ; CAVI  $\geq$  9: b = 0.9, st.err.b = 0.75, P = 0.008).

The CAVIAge model demonstrated high sensitivity and specificity ( $> 70\%$ ) compared to the CAVI<sup> $\geq 9$ </sup> model (sensitivity 62%, specificity 58%). In ROC curve analysis, the CAVIAge model had a significantly higher  $AUC = 0.802$  (Fig. 8) than the CAVI<sup>≥ 9</sup> model: AUC = 0.674 (P < 0.05) (Fig. 9).

In the  $\geq$  50 years group, age, SBP, TC and glucose level were included in the prediction models for high arterial stiffness (CAVI<sup>Age</sup> and CAVI<sup>≥ 9</sup>). Both models were significant: CAVI<sup>Age</sup> (b = 2.6, st.err.b = 1.13, P < 0.001) and CAVI<sup> $\geq$ 9</sup> (b = 5.3, st.err.b =  $0.94$ , P <  $0.001$ ). For the CAVI<sup>Age</sup> model, SBP level was independently correlated with CAVI value ( $b = 2.1$ , st.err.b = 1.53, P < 0.001). For the CAVI<sup> $\geq$ 9</sup> model, age (b = 3.46, st.err.b = 2.18, P < 0.001), SBP (b = 2.07, st.err.b = 1.9,  $P < 0.001$ ) and glucose (b = 1.43, st.err.b = 0.86, P < 0.001) levels were independently correlated with CAVI value.

Both models demonstrated high sensitivity and specificity  $(> 70\%)$ . When ROC curves were analyzed for the CAVI<sup>Age</sup> model, the AUC value of 0.675 (Fig. 10) was significantly lower when compared to the CAVI<sup>≥ 9</sup> model (AUC = 0.787, P  $= 0.031$ ) (Fig. 11).

## **Discussion**

Arterial stiffness is a marker of vascular wall condition and an integral predictor of CVD risk. In our study, it was assessed by CAVI level, which is less dependent on blood pressure (BP) and heart rate (HR), in contrast to other markers of arterial stiffness [21, 22]. The study cohort ( $n = 600$ ) was dominated by young and middle-aged individuals. The prevalence of traditional CVD risk factors such as arterial hypertension [23],



**Figure 2.** Correlation matrix between vascular stiffness markers, risk factors, clinical and biochemical measurements in patients < 50 years of age. HTN: hypertension; IGT: impaired glucose tolerance; BMI: body mass index; WC: waist circumference; HC: hip circumference; SBP: systolic blood pressure; DBP: diastolic blood pressure; TC: total cholesterol; LDL: low-density lipoprotein; HDL: high-density lipoprotein; TG: triglycerides; GFR: glomerular filtration rate; LAP: lipid accumulation product; VAI: visceral adiposity index; BFP: body fat percentage.

obesity [24], and dyslipidemia [25] was similar to that in the general population [23-25]. To identify increased arterial stiffness, we compared two approaches: the universal, unified for all age categories CAVI<sup>2 9</sup> [12] and the age-specific CAVI<sup>Age</sup> [14]. The CAVI<sup>Age</sup> method allowed us to identify significantly more individuals with increased arterial stiffness (1.81-fold) at the expense of younger patients. Only at the age of over 70 years CAVIAge identified significantly fewer individuals with increased arterial stiffness than CAVI<sup>≥9</sup>.

Patients were divided into the  $\leq 50$  and  $\geq 50$  years of age groups to assess the contribution of the main risk factors in the development of increased arterial stiffness and for statistical analysis. The rationale for this division was the fact that a significant increase in arterial stiffness [8] with a shift of CAVI [14] into the gray zone (8 - 9) is observed in individuals over 50 years of age.

In correlation analysis, CAVI was significantly associated with age in both  $\leq 50$  and  $\geq 50$  years of age groups. The significance of age was confirmed in Random Forest and multiple regression analysis. Age is a major factor for increasing arterial wall stiffness in general [8] and CAVI marker in particular [26-28].

Otherwise, factors associated with arterial stiffness differed between the  $\leq 50$  years and  $\geq 50$  years groups. In younger individuals, CAVI correlated with DBP, metabolic markers (LDL, LAP, VAI) and GFR. In the older group, CAVI was associated with hypertension, its stage and grade, SBP, and other metabolic markers (hyperlipidemia, IGT, TC and glucose level). The association of hypertension with increased arterial stiffness was demonstrated in the wide range of studies [8, 28-31]. High SBP and pulse pressure commonly described in elderly patients with isolated systolic hypertension are traditional markers of



**Figure 3.** Correlation matrix between vascular stiffness markers, risk factors, clinical and biochemical measurements in patients ≥ 50 years. HTN: hypertension; IGT: impaired glucose tolerance; BMI: body mass index; WC: waist circumference; HC: hip circumference; SBP: systolic blood pressure; DBP: diastolic blood pressure; TC: total cholesterol; LDL: low-density lipoprotein; HDL: high-density lipoprotein; TG: triglycerides; GFR: glomerular filtration rate; LAP: lipid accumulation product; VAI: visceral adiposity index; BFP: body fat percentage.

increased arterial stiffness [8]. Our data also showed the association of CAVI with the grade of SBP and characteristics of hypertension in the group  $\geq 50$  years of age. In the younger group, there was an association with DBP and no association with SBP. The phenomenon of isolated diastolic hypertension occurs in 2.5-7.8% of cases [20]. The highest prevalence of this disease is noted in individuals 30 - 39 years with its decrease in the fifth to sixth decade of life and almost complete absence in individuals older than 70 years [32].

Data on the relationship between CAVI and various metabolic markers (weight, BMI, HC, TC, LDL) are controversial. In the work of Safronova et al [28], a group of young healthy patients without hypertension and carbohydrate metabolism disorders (mean age 30.4 years) did not demonstrate significant correlations between CAVI and dyslipidemia markers.

Apparently, it may be due to the peculiarities of the free from significant metabolic disorders sample. In our study, we found positive correlations of CAVI with integral metabolic indices (LAP and VAI) and LDL level in the < 50 years group, and with the presence of dyslipidemia, TC and glucose level in the  $\geq$  50 years group. Correlations of CAVI with integral metabolic indices (LAP and VAI) were previously described in apparently healthy young adults [33]. These correlations of CAVI with LAP and VAI indices reflect multifactorial relationships of arterial stiffness with anthropometric and laboratory metabolic indices [33]. Our data partially agree with the work of Kaveshnikov et al, which revealed direct correlations of CAVI with such marker of dyslipidemia as TG level [27]. In the study of Topouchian et al [34], older individuals with and without metabolic syndrome demonstrated positive correlation of CAVI with



Figure 4. Significance of CAVI<sup>Age</sup> model components for detecting high arterial stiffness (Random Forest estimation) in the < 50 years group. DBP: diastolic blood pressure; LDL: low-density lipoprotein; GFR (EPI): glomerular filtration rate (calculated by Chronic Kidney Disease Epidemiology Collaboration equation); LAP: lipid accumulation product index; VAI: visceral adiposity index.



**Figure 5.** Significance of the CAVI≥ 9 model components for detecting high arterial stiffness (Random Forest estimation) in the < 50 years group. DBP: diastolic blood pressure; LDL: low-density lipoprotein; GFR (EPI): glomerular filtration rate (calculated by Chronic Kidney Disease Epidemiology Collaboration equation); LAP: lipid accumulation product index; VAI: visceral adiposity index.



**Figure 6.** Significance of CAVIAge model components for detecting high arterial stiffness (Random Forest estimation) in the ≥ 50 years group. SBP: systolic blood pressure; TC: total cholesterol; IGT: impaired glucose tolerance.

hypertension and hyperglycemia. A study by Lopes-Vicente et al found the association of pulse wave velocity, other markers of arterial stiffness, with age, SBP and such metabolic parameters as TG, HDL and glucose level [35]. However, the difference from our study was the older age of the participants (49  $\pm$ 8 years) and higher BMI ( $32 \pm 4$  kg/m<sup>2</sup>).

In our work, we attempted to predict increased arterial stiffness on the basis of screening parameters. Similar work for the prediction of EVA was performed by Antza et al. They used the more labor-intensive research method of daily BP monitoring as a predictor of arterial stiffness [36]. We also identified age-specific predictors of arterial stiffness: age and LDL level in individuals < 50 years and age, SBP, TC and glucose level in individuals  $\geq$  50 years. Two strategies for predicting increased stiffness showed different sensitivity and specificity with higher values for the model with age-specific thresholds  $(CAVI<sup>Age</sup>)$ 



Figure 7. Significance of CAVI<sup>≥ 9</sup> model components for detecting high arterial stiffness (Random Forest estimation) in the ≥ 50 years group. SBP: systolic blood pressure; TC: total cholesterol; IGT: impaired glucose tolerance.



Figure 8. ROC curves for the logistic regression model determining arterial stiffness using CAVI<sup>Age</sup> in the < 50 years group. ROC: receiver operating characteristic.

in the  $\leq$  50 years group and with universal thresholds (CAVI $\geq$ <sup>9</sup>) in the  $\geq$  50 years group.

An attempt to determine alternative age-specific CAVI references was also made in a study by Safronova et al [28]. The mean CAVI values calculated for patients < 50 years were also lower than the universal one [28]. However, this study

did not compare sensitivity and specificity of universal and formula-derived CAVI references.

The inclusion of apparently healthy people in the main sample was the limitation of our study, making it difficult to extrapolate these results to CVD patients. In addition, this study did not divide patients into groups with and without obe-



**Figure 9.** ROC curves for the logistic regression model determining arterial stiffness using CAVI<sup>≥ 9</sup> in the < 50 years group. ROC: receiver operating characteristic.



**Figure 10.** ROC curves for the logistic regression model determining arterial stiffness using CAVI<sup>Age</sup> in the ≥ 50 years group. ROC: receiver operating characteristic.

sity, metabolic syndrome and other significant risk factors. It might broaden our understanding of the efficacy of this diagnostic approach in individual patient groups.

Our study suggests the possibility of using the differentiated approach to screening patients of different age catego-

ries. The results obtained in our study require further validation and can only be used on practically healthy individuals. In the  $\leq 50$  years group, the model based on age-specific CAVI thresholds has the higher predictive value, sensitivity, and specificity for identifying individuals with increased



**Figure 11.** ROC curves for the logistic regression model determining arterial stiffness using CAVI<sup>≥9</sup> in the ≥ 50 years group. ROC: receiver operating characteristic.



Figure 12. Algorithm for choosing CAVI reference values in apparently healthy adults. CAVI<sup>Age</sup>: age-specific cardio-ankle vascular index reference values; CAVI: cardio-ankle vascular index.

arterial stiffness. In contrast, in the  $\geq$  50 years group, a predictive model using a universal threshold value of CAVI<sup> $\geq 9$ </sup> has advantages. This approach (Fig. 12) can be used prospectively for screening stratification of apparently healthy people to identify groups for in-depth screening and inclusion of preventive measures.

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## **Conflict of Interest**

The authors declare that they have no conflict of interest.

## **Informed Consent**

All patients provided written informed consent.

# **Author Contributions**

Conceptualization: AB, VP and ND; methodology: AB, ND and TG; software: TG; validation: AB and ND; formal analysis: ND, TG; data collection and analysis: ND, LV, EU, AR, RS, OA, AK and KN; interpretation of data: AB, YR, ND and LV; data curation: AB, YR, ND, LV and VP; writing - original draft preparation: YR, ND, KN and LV; writing - review and editing: AB, YR, ND, KN and VP; writing - literacy search: YR and ND; supervision: VP; project administration: VP. All authors approved the final version of the manuscript for submission.

# **Data Availability**

The authors declare that data supporting the findings of this study are available within the article.

## **Abbreviations**

AUC: area under the ROC curve; BMI: body mass index; BFP: body fat percentage; BP: blood pressure; CAVI: cardio-ankle vascular index; CVD: cardiovascular disease; DBP: diastolic blood pressure; ENIGMA: enhancing neuroimaging genetics through meta-analysis; ESSE-RF2: epidemiology of cardiovascular diseases in the regions of the Russian Federation, the second study; EVA: early vascular aging; GBD: the Global Burden of Disease, Injuries, and Risk Factors Study; GFR: glomerular filtration rate; HC: hip circumference; HDL: high-density lipoprotein; HTN: hypertension; HVA: healthy vascular aging; IGT: impaired glucose tolerance; IHD: ischemic heart disease; LAP: lipid accumulation product; LDL: low-density lipoprotein; NCD: non-communicable diseases; ROC: receiver operating characteristic; SBP: systolic blood pressure; SCORE2: systematic coronary risk evaluation 2; st.err.b: standard error b; SUPERNOVA: supernormal vascular aging; TC: total cholesterol; TG: triglycerides; VAI: visceral adiposity index; WC: waist circumference

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