#### **ORIGINAL ARTICLE**



# Variability of electrochemical skin conductance for screening diabetes mellitus

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#### Abstract

Electrochemical skin conductance (ESC) has been suggested as a noninvasive diabetic screening tool. We examined the relevance of ESC method for screening type 2 diabetes. A meal tolerance test (MTT) was conducted for 40 diabetic and 42 control subjects stratified by age, sex and body mass index (BMI). The glucose levels and ESC were measured before the MTT and every 30 min after meal intake up to 120 min. There was no correlation between the blood glucose level and ESC (r=0.249) or ESC variability (ESCV) (r=-0.173). ESC (ESCV) was higher (lower) in diabetic patients than in normal control (p=0.02 for ESC and p=0.06 for ESCV). Receiver operating characteristic analysis showed that the area under the curve (AUC) values of the ESC and ESCV were 0.654 and 0.691, respectively. The novel variable, ESCV, showed 5.7% higher AUC than ESC. Contrary to some previous reports, ESC values in diabetic patients was higher than in age, sex and BMI matched control group. In our study, ESC or ESCV showed a marginal accuracy to be used as a screening tool for diabetes mellitus.

Keywords Electrochemical skin conductance (ESC) · Diabetes · Noninvasive diagnosis · Oral glucose tolerance test

# 1 Introduction

According to the National Health Insurance Corporation data released by the Ministry of Health and Welfare of Korea in 2016, the incidence of diabetes in Korea increased by 25% from approximately 2 million to 2.5

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Horyong Yoo hryoo@dju.kr million between 2010 and 2015. Globally, it has increased four times between 1980 and 2014, reaching 422 million people, accounting for approximately 8.5% of the world's population [1]. Signs of early diabetes mellitus are not well documented, and early detection is difficult because the rate of progression is significantly slower than that in most diseases. Diabetes is also associated with neuropathy, vascular injury and various complications [2–4]. Because

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diabetes is irreversible and requires continuous blood glucose management, continuous blood glucose monitoring is essential for the health maintenance of diabetic patients. Blood glucose monitoring is commonly practiced by invasive blood sampling, which can be both uncomfortable and unsanitary. Recently, various non-invasive blood glucose monitoring methods have been proposed to overcome the disadvantages of conventional blood glucose monitoring [5]. The techniques used for the measurement of non-invasive blood glucose include reverse iontophoresis, bioimpedance spectroscopy, heat irradiation spectroscopy, absorption spectroscopy, ultrasound, electromagnetic measurement, temperature control local reflection, and optical coherence tomography.

Recently, electrochemical skin conductance (ESC) has been used as a noninvasive diabetic screening tool [6] to measure the concentration of ions released from sweat glands by applying a voltage to the skin and measuring the change in electrical conductivity. ESC is based on reverse iontophoresis and electrochemistry. For example, when an applied voltage is gradually increased by attaching an electrode to a peripheral limb with high sweat gland density (e.g., a hand or a foot), a voltage value at which a current begins to flow can be measured to determine the concentration of the discharged ions. Here, the concentration of the discharged ions through the voltage application is related to the degree of activity of the sweat glands [7, 8]. As diabetes progresses, degeneration of the peripheral nerve fibers reduces the nerve distribution of the exocrine glands and eventually leads to diminished gland function [9, 10]. Therefore, ESC has the potential to be used as a non-invasive tool to screen diabetes mellitus and its progression [6].

Attempts to verify the association between ESC and diabetes mellitus have been reported in recent publications. In particular, ESC classifies patients with diabetic neuropathy as relatively high performance (AUC 0.7) [11]. However, some studies [9, 12–18] have limited clinical validity because they did not adequately account for confounding effects such as age, gender or obesity. In addition, many studies have focused on patients with diabetes-related complications such as heart disease and neuropathy.

In this study, ESC measurements were performed on patients with type 2 diabetes without regard to the specific complications associated with diabetes mellitus in order to test the validity of ESC experimentally. For this purpose, we emphasize that we selected the control group through stratified sampling considering the demographic information of diabetic patients. We proposed a novel approach using ESC as a non-invasive method of testing the diabetes mellitus. A protocol was developed and experimentally tested to verify this method.

#### 2 Methods

#### 2.1 Study design and participants

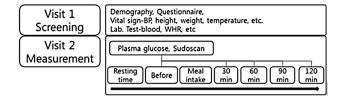
A clinical study was conducted from June 2016 to February 2017, with the approval of the Institutional Review Board at Dunsan Korean Medicine Hospital of Daejeon University (IRB number: DJDSKH-16-BM-04), and was registered with the Clinical Research Information Service (registration number: KCT0002132). Subjects with hypertension (SBP(Systolic blood pressure) is greater than 160 mmHg or DBP(Diastolic blood pressure) greater than 90 mmHg), hypothyroidism, severe renal disease, liver dysfunction, cardiovascular disease, thyroid disease, pacemaker, hypersensitivity to electronic devices, anemia and physical handicaps were excluded. Pregnant or lactating women, or those with taking contraceptives were also excluded.

Diabetic patients were defined as those with mild and moderate diabetes mellitus regardless of type of diabetes, fasting blood glucose (FPG) levels greater than 126 mg/ dl, or glycated hemoglobin (HbA1c) greater than or equal to 48 mmol/mol (6.5%). Patients whose FPG level was higher than 250 mg/dl or HbA1c concentration higher than 69.4 mmol/mol (8.5%) were excluded due to the risk. For the patient group, concomitant medications related to regulating blood glucose were allowed during the study. Controls were defined those with no history of diabetes, FPG levels < 100 mg/dl and HbA1c levels < 42 mmol/mol (6%). The FPG and HbA1c concentrations were measured from blood plasma using standardized laboratory methods. All participants were informed about the purpose and method of the study and agreed to participate in the study with written informed consent.

Based on the results of the 2010 Population and Housing Census [19] and 2014 National Health and Nutrition Examination [19] released by the Korea Statistical Office for sampling, the data was collected according to sex, age group (40 s, 50 s, and 60 years old and older), and body mass index (BMI) (less than 25 and more than 25) and were used as stratification variables; sample allocation based on Neyman's method was performed for a total of 12 layers.

#### 2.2 Measurements

We established a standard meal tolerance test (MTT) protocol to investigate the influence of diabetes mellitus on ESC at the stage of fasting and blood glucose modulation (Fig. 1). As shown in Fig. 1, a basic questionnaire, measurement of physical information, and Privacy Policy



**Fig. 1** Outline of the study protocol. Participants visited twice. The questionnaire and measurement of physical information were obtained at the first visit, and physiological data such as temperature, glucose level, and Sudoscan measurement were obtained at the second visit

Agreement were conducted at the first visit (Visit 1). A second visit (Visit 2) was arranged within 1 week for the eligible subjects. Glucose and ESC were measured according to the MTT protocol.

At Visit 2, after 8 h of fasting, vital signs such as body temperature and blood pressure were measured, and blood was collected from the vein. ESC was measured on both hands and feet using a Sudoscan device (Impeto Medical, Paris, France) [20]. SUDOSCAN is a device capable of measuring galvanic skin responses as shown in Table 1. Sudoscan is a quick, non-invasive device for the assessment of sudomotor function through evaluation of sweat gland secretory function as an early reflection of sympathetic nerve impairment [21]. Measurement is based on an electrochemical reaction between electrodes and chloride ions, after stimulation of sweat glands by a low-voltage current. A measurement of conductance for the hands and feet is generated from the derivative current associated with the applied voltage [11].

The electrodes of the Sudoscan were kept clean by removing dust at every measurement, as shown in Fig. 2. Each Sudoscan measurement lasted approximately 5 min. After the fasting period, the subjects were given a pre-prepared amount of food: bread and juice containing a calorie equivalent to that of 75 grams of glucose. Blood sampling and ESC measurement by Sudoscan were performed at 30, 60, 90 and 120 min after the food intake. At each measurement point,

Table 1 The specification of Sudoscan

	Value
Sampling frequency	100 Hz
Resolution	1 nanoSiemens
Precision	±1%
Measurement voltage	1–4 V DC
Frequency	0 Hz (DC current)
Number of electrodes	each two electrodes for foot and hands



Fig. 2 Measuring ESC using a Sudoscan device. The subject puts his/ her hands and feet on the electrodes

the blood glucose levels were monitored not to exceed the risk level using a portable glucose monitoring device (Johnson & Johnson, New Jersey, USA).

For classification of diabetic patients, we used fasting-state ESC (ESC<sub>0</sub>), as well as ESC values at 30 min (ESC<sub>30</sub>), 60 min (ESC<sub>60</sub>), 90 min (ESC<sub>90</sub>), and 120 min (ESC<sub>120</sub>) after the meal intake. In addition, we defined ESC variability (ESCV) in Eq. (1) in order to reduce the individual difference and used it for the analysis with the assumption that the electrophysiological changes due to the MTT would be different between the diabetic patients and control group.

$$ESCV = \max(ESC_{0}, ESC_{30}, ESC_{60}, ESC_{90}, ESC_{120}) - \min(ESC_{0}, ESC_{30}, ESC_{60}, ESC_{90}, ESC_{120})$$
(1)

ESCV represents the difference between the maximum and minimum of the ESC values measured five times within 2 h according to the MTT protocol. We obtained ESCVs at the hands (ESCV<sub>hands</sub>) and feet (ESCV<sub>feet</sub>) by Eq. (1) and further calculated their average (ESCV<sub>avg</sub>) by ESCV<sub>avg</sub> = (ESCV<sub>hands</sub> + ESCV<sub>feet</sub>)/2.

#### 2.3 Statistical analyses

The statistical significance for all analyses was set to  $\alpha = 0.05 \ (95\%)$ . Continuous and categorical variables were summarized by their mean and standard deviation (SD) and frequency and percentage, respectively. Independent two-sample *t* test was performed for each variable to investigate the difference between the diabetic patient and control group. We calculated the area under the curve

(AUC) of the receiver operating characteristic (ROC) curve to assess the discriminant performance for ESC measures based on linear predictors derived from logistic regression through tenfold cross validation. In addition, the relationship between the duration of diabetes and ESC measurement was assessed by one-way analysis of variance (ANOVA).

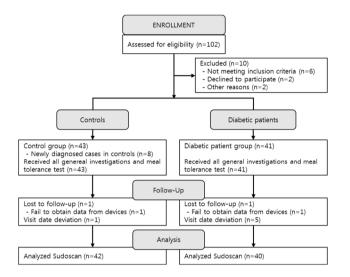


Fig. 3 Flow diagram of the study

Table 2Baseline characteristicsof diabetes patients and controls

## **3 Results**

#### 3.1 Patient enrolment and classification

As shown in Fig. 3, 46 diabetic patients and 46 healthy controls were recruited for the study. In clinical trials, one patient dropped out of each group due to missing measurement data. In the data review process after the completion of the clinical trial, eight patients were found to be classified differently from the HbA1c standard of the clinical trial plan and were excluded from the analysis. Finally, we analyzed the results of 82 patients, including 40 diabetic patients (23 men and 17 women) and 42 control subjects (24 men and 18 women).

The mean ages of diabetic patients (n = 40) and control group patients (n = 42) were  $61.4 \pm 8.6$  years and  $61.4 \pm 8.6$  years, respectively. There were no significant differences in the age, height, weight, BMI, waist circumference, hip circumference, systolic blood pressure, diastolic blood pressure, pulse, and body temperature of the patients and controls. As shown in Table 2, the ratio of the waist circumference to hip circumference (WHR), glycated hemoglobin, and fasting blood glucose showed a significant difference between the patient group and the control group. The glycemic hemoglobin was  $6.7 \pm 0.8\%$  in the patient group and  $5.6 \pm 0.4\%$  in the control group. The fasting blood glucose level was  $133.7 \pm 30.4$  mg/dL and  $101.7 \pm 9.3$  mg/dL,

Variables	Diabetes patients $(n=40)$	Controls $(n=42)$	P value
Sex			
Male	23 (57.5%)	24 (57.1%)	
Female	17 (42.5%)	18 (42.9%)	
Age (year)	$61.4 \pm 8.6$	$58.2 \pm 8.8$	0.096
Anthropometrics			
Height (cm)	$161.0 \pm 10.6$	$161.4 \pm 8.8$	0.828
Weight (kg)	$65.5 \pm 10.6$	$64.1 \pm 12.3$	0.572
Body mass index (kg/m <sup>2</sup> )	$25.3 \pm 3.2$	$24.4 \pm 3.4$	0.258
Waist circumference (cm)	$89.8 \pm 8.5$	$86.1 \pm 8.7$	0.052
Hip circumference (cm)	$97.1 \pm 5.7$	$97.2 \pm 6.8$	0.969
WHR	$0.93 \pm 0.10$	$0.89 \pm 0.00$	0.002
Vital signs			
Systolic blood pressure (mmHg)	$125.9 \pm 12.4$	$122.0 \pm 14.1$	0.195
Diastolic blood pressure (mmHg)	$77.8 \pm 9.1$	$75.6 \pm 10.3$	0.713
Pulse rate (bpm)	$74.4 \pm 10.3$	$70.4 \pm 10.3$	0.086
Body temperature (°C)	$36.6 \pm 0.3$	$36.6 \pm 0.2$	0.640
Blood parameters			
Glycated hemoglobin (%)	$6.7 \pm 0.8$	$5.6 \pm 0.4$	0.000
Fasting plasma glucose (mg/dL)	$133.7 \pm 30.4$	$101.7 \pm 9.3$	0.000

WHR, waist to hip circumference; fasting glucose, glucose level before meal intake

respectively. WHR was  $0.93 \pm 0.1$  in the patient group and  $0.89 \pm 0.0$  in the control group, respectively.

## 3.2 ESC analysis

The ESC values measured at both the hands and feet using Sudoscan in the fasting state are shown in Table 3 for patients and normal control subjects. Figure 4 shows the receiver operating characteristic (ROC) of ESC values for diabetic patients. The AUC values obtained using ESC measurements at the hands (ESC<sub>hands</sub>), ESC measurements at the feet (ESC<sub>feet</sub>), and average ESC (ESC<sub>avg</sub>) at the hands and feet were 0.650, 0.626, and 0.644, respectively.

## 3.3 ESC variability (ESCV)

The difference (ESCV) between the maximum and minimum values of the five ESCs was  $11.4 \,\mu\text{S}$  in the patient group and 15.1  $\mu$ S in the control group as shown in Table 4. Both the mean of the ESC standard deviation and ESCV were smaller in patients. To examine the utility of ESCV, the five ESCs (ESC<sub>0</sub>, ESC<sub>30</sub>, ESC<sub>60</sub>, ESC<sub>90</sub>, and ESC<sub>120</sub> were measured according to the MTT protocol) and were selected a criterion for ESCV to obtain a  $2 \times 2$  confusion matrix. Figure 5 shows the resulting confusion matrix of true-positive (top left), false-negative (top right), false-positive (bottom left), and true-negative (bottom right) with the ESCV criterion of 10.5 µS for both patients and control subjects. To provide an illustration, the graph at the upper left represents a group of people whose ESCV is less than 10.5 µS and are predicted as patients (first column) among true patients (first row). As a result, due to the MTT, 70.0% of the patients were changed to smaller than 10.5  $\mu$ S of ESC and 66.7% of the control group were changed to larger than 10.5 µS of ESC: sensitivity, 70.0%; specificity, 66.7%; accuracy, 68.3%.

To test the classification performance of ESC and ESCV, we conducted a tenfold cross-validation test. The accuracy values and AUCs using the ESC and ESCV values of the hands, feet and both the hands and feet were examined and presented in Table 5. The best results were shown to be with the ESCV of the feet with AUC = 0.703. In all cases, the AUCs of ESCV were a little higher than those of ESCs. The correlation between blood glucose level and ESC is

1.0 0.8 0.6 Sensitivity 0.4 ESC 0.2 ESC. ESC 0.0 0.2 0.4 0.6 0.8 0.0 1.0 1-Specificity

Fig. 4 ROC curve for the measured ESC values

r = 0.249, between the blood glucose level and ESCV is r = -0.173, and between ESC and ESCV is r = -0.542.

#### 3.4 Duration of disease and ESC response

To test the ESC and ESCV responses according to the duration of the disease, we divided the patients into three groups: less than 10 years of disease duration (n: 27, age:  $59.8 \pm 8.3$ ), between 10 years and 20 years (n: 8, age:  $65.1 \pm 10.3$ ), over 20 years (n: 5, age:  $64.2 \pm 5.5$ ). No significant difference was found between the control group and three sub-groups of the patients. In Fig. 6, we presented the ESC<sub>avg</sub> and ESCV<sub>avg</sub> of all participants according to the duration of the disease. In terms of disease duration, the mean value of ESCV<sub>avg</sub> showed decreasing tendency from  $12.2 \pm 10.9 \ \mu\text{S}$ to  $6.3 \pm 2.7 \ \mu\text{S}$  as the duration of the disease increased, even though it was not statistically significant (Fig. 6).

### 4 Discussion

There was a statistically significant difference in ESC values between diabetic patients group and normal control group as shown in Table 3. Previous studies reported that ESC value was higher in the healthy normal group than in

Table 3 Mean ESC values of diabetes patients and controls

	Diabetes patients $(n=40)$	Controls (n=42)	P value
ESC <sub>avg</sub> (µS)	$68.1 \pm 13.6$	$60.8 \pm 15.7$	0.027
ESC <sub>hands</sub> (µS)	$64.2 \pm 16.2$	$55.1 \pm 19.1$	0.022
$ESC_{feet}\left(\mu S\right)$	$72.0 \pm 13.6$	$66.5 \pm 14.7$	0.084

Table 4 Mean ESCV values of diabetes patients and controls

	Diabetes patients (n=40)	Controls (n=42)	P value
ESCV <sub>avg</sub> (µS)	11.4±9.5	15.1±7.7	0.063
$ESCV_{hands}$ ( $\mu S$ )	$15.2 \pm 10.7$	$19.0 \pm 9.3$	0.086
$ESCV_{feet}\left(\mu S\right)$	$10.1 \pm 9.1$	$12.9 \pm 8.0$	0.137

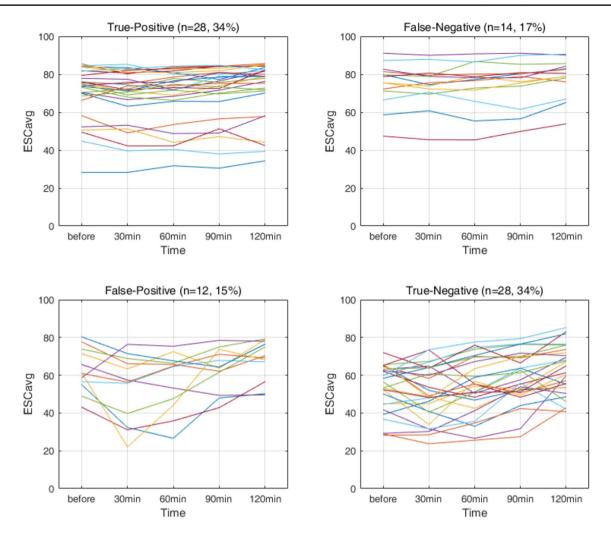


Fig. 5 ESC changes according to the measurement time for 4 groups divided by the criterion of ESCV =  $10.5 \mu$ S. Top-left: true positive. Top-right: false negative. Bottom-left: false positive. Bottom-right: true negative

Table 5Accuracy and AUCof ROC curve analysis with a		Both hands and feet		Hands		Feet	
tenfold cross-validation	_	Accuracy	AUC	Accuracy	AUC	Accuracy	AUC
	ESC	0.611	0.654	0.572	0.626	0.588	0.653
	ESCV	0.649	0.691	0.613	0.676	0.539	0.703

The correlation between blood glucose level and ESC is r=0.249, between the blood glucose level and ESCV is r=-0.173, and between ESC and ESCV is r=-0.542

the diabetic patient's group due to impaired sweat gland function or autonomic nerve response [22]. However, similar to our results, some studies reported the opposite behaviour; skin conductive increased in the diabetic patients in the stage when the sympathetic nerve is promoted due to *Yin deficiency* symptom, in Korean Medicine [23–25]. As in Table 2, there was no statistically significant difference in sex, age, vital signs and anthropometric data, but the patient group and the control group were clearly distinguishable from the blood glucose level. It certified that the patient group and control group were appropriately sampled. Together with our results, the reliability of ESC in its simple form is not yet justified for discriminating diabetic mellitus because of inconsistent or controversial reports [26]. The AUC to discriminate diabetic patients from normal control was only 0.644, which was far less accurate than that of the blood test (AUC = 0.906).

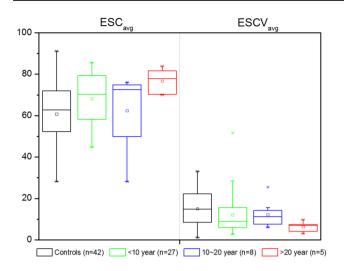


Fig.6 ESC and ESCV of controls and patients by the disease duration. No statistical significance was found between subgroups

In the case of diabetic nephropathy, the ESC measured at feet was reported more sensitive than that at hands [11]. In contrast, in our study, the ESC at hands showed better performance than at feet. In the case of diabetic nephropathy, neuropathic damages would occur more severely at feet than at hands. Another possibility for this contrasting behavior is that the drugs taken by diabetic patients may regulate the autonomic nervous system [27, 28]. Time-dependent changes of bio-signals within an individual may be used for health examination [27-29]. In this study, we proposed a novel ESCV, the change in the ESC value from the same subject during an MTT. The accuracy was improved slightly from ESC.

This study was limited as follows. First, it was studied in a clinic with a small sample size. The age-dependent trend of the ESC may exist and site-dependency should be crosschecked by a multicenter study. Second, this was a crosssectional study. A long-term follow-up study will be needed to discuss changes dependent on disease-period in the ESC and ESCV.

## 5 Conclusion

Using a standard MTT protocol for 40 diabetic patients and 42 control subjects with matched age, sex and BMI, the variability of ESC before and after MTT showed better performance than ESC in classifying diabetic patients. The classification accuracy was marginal to be used as a screening tool for diabetes mellitus, as AUC=0.654 for ESC<sub>avg</sub> and AUC=0.691 for ESCV<sub>avg</sub> by a ROC curve analysis (tenfold cross-validation). Diverse drugs taken by diabetic patients accompany electrophysiological changes through autonomic nervous responses, which uncontrollably affects ESC values and have limited the applicability of the noninvasive ESC for the screening and monitoring of diabetes. The reduced values of ESCV for diabetic patients may imply that diabetic patients have degraded electrophysiological adaptability to maintain homeostasis after a physiological load such as an MTT. Studies with larger populations or with an animal model are needed for the verification of clinical usefulness of ESC technique for diabetic mellitus.

Authors' contribution SK and JHC wrote the manuscript and analysed data. BK designed the clinical study and analyzed data. MHJ analysed data. GK designed and monitored the clinical study. HRY and SSP performed the clinical study. JUK conceived the study, analysed data and wrote the manuscript.

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#### **Compliance with ethical standards**

**Conflict of interest** The authors declare that they have no conflict of interest.

Availability of data and materials Data will be available upon individual request.

**Ethical approval** All procedures involving human participants were in accordance with the ethical standards of the institutional research board and with the 1964 Helsinki declaration and its successive amendments.

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