Volume 7, Issue 5, September 2013 © Diabetes Technology Society

Infrared Thermal Imaging for Automated Detection of Diabetic Foot Complications

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Abstract

Background:

Although thermal imaging can be a valuable technology in the prevention and management of diabetic foot disease, it is not yet widely used in clinical practice. Technological advancement in infrared imaging increases its application range. The aim was to explore the first steps in the applicability of high-resolution infrared thermal imaging for noninvasive automated detection of signs of diabetic foot disease.

Methods:

The plantar foot surfaces of 15 diabetes patients were imaged with an infrared camera (resolution, 1.2 mm/pixel): 5 patients had no visible signs of foot complications, 5 patients had local complications (e.g., abundant callus or neuropathic ulcer), and 5 patients had diffuse complications (e.g., Charcot foot, infected ulcer, or critical ischemia). Foot temperature was calculated as mean temperature across pixels for the whole foot and for specified regions of interest (ROIs).

Results:

No differences in mean temperature >1.5 °C between the ipsilateral and the contralateral foot were found in patients without complications. In patients with local complications, mean temperatures of the ipsilateral and the contralateral foot were similar, but temperature at the ROI was >2 °C higher compared with the corresponding region in the contralateral foot and to the mean of the whole ipsilateral foot. In patients with diffuse complications, mean temperature differences of >3 °C between ipsilateral and contralateral foot were found.

Conclusions:

With an algorithm based on parameters that can be captured and analyzed with a high-resolution infrared camera and a computer, it is possible to detect signs of diabetic foot disease and to discriminate between no, local, or diffuse diabetic foot complications. As such, an intelligent telemedicine monitoring system for noninvasive automated detection of signs of diabetic foot disease is one step closer. Future studies are essential to confirm and extend these promising early findings.

J Diabetes Sci Technol 2013;7(5):PAGE NUMBERS

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Abbreviations: (ROI) region of interest, (SD) standard deviation

Keywords: automatic detection, diabetic foot, infrared imaging, prevention, telemedicine, thermography

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Introduction

oot ulcers are a frequent and costly complication of diabetes, with a lifetime incidence of 15–25% and up to 20% of the total health care expenditure on diabetes attributable to foot ulcers.^{1,2} If left untreated, ulcers will become severely infected and ultimately result in amputation of the limb and/or death.^{2,3} Diabetic foot ulcers are preventable through the early detection and timely treatment of signs of diabetic foot disease.² However, early detection depends on frequent assessment, which may be limited for various reasons. Self-examination can be difficult or impossible due to the health impairments related to diabetes or social impairments. A sufficiently frequent examination by health care professionals would be too intrusive and costly and is also limited because, for example, the human hand is not an objective means to assess temperature, which is a marker of underlying inflammation.⁴ Our ultimate objective is to develop an intelligent telemedicine monitoring system that can be deployed for frequent examination of the patient's feet to timely and automatically detect signs of diabetic foot complications.

Thermal imaging is a promising technology to achieve this objective, as increased plantar foot temperature is a key sign of underlying inflammation. Thermal imaging has been shown to be a useful technique in the clinical management of the diabetic foot. Several diabetic foot complications such as neuropathic ulcers, so steomyelitis, and Charcot foot, have been identified at increased temperature locations. Increased plantar foot temperature may even be present a week before a neuropathic ulcer appears. Clinical studies on home-monitoring of plantar foot temperature based on that finding have shown that frequent temperature assessments and immediate treatment in case of temporally persistent temperature differences (>2.2 °C) between a foot region and the same region in the contralateral foot can prevent diabetic foot ulcers. On the other hand, decreased foot temperatures may indicate vascular insufficiency in the foot. Finally, a relationship between a temperature-based wound inflammatory index and wound healing has been proposed as a robust indicator of tissue health with a quicker response time to predict healing versus wound size.

A variety of thermal imaging techniques have been used and tested to date, of which infrared imaging and liquid crystal thermography seem to hold most promise for use in daily clinical practice. 5,15,18 Compared with liquid crystal thermography, infrared imaging has the advantage of being a noninvasive measurement with possibilities for automatic analysis. As such, infrared imaging shows greater potential for telemedical applications and will be the focus of this article. The first clinical application of infrared imaging in the diabetic foot was measurement of plantar foot temperatures using a handheld thermometer as described by Lavery and coauthors 12-14 in their clinical studies. Although being low cost, the disadvantages of such a thermometer are: low spatial resolution (temperature is measured on selected individual spots only), the necessity that patients perform the measurement themselves, and lack of options for automatic analysis. Furthermore, results on sensitivity and specificity of the algorithm used in these clinical studies have not been published to date. With technological advancements in infrared imaging and analysis, it is possible to overcome these limitations. The aim of this study was to explore the first steps in the applicability of high-resolution infrared thermal imaging for noninvasive automated detection of signs of diabetic foot disease.

Methods

For this pilot study, a convenience sample of 15 patients with diabetes mellitus type 1 or 2 was obtained, equally divided over three groups: 5 patients without present signs of diabetic foot complications, 5 patients with local signs of diabetic foot complications (e.g., abundant callus or neuropathic ulcer), and 5 patients with diffuse complications (e.g., Charcot foot, infected ulcer, or critical ischemia). Screening and diagnosis for presence of signs of diabetic foot complications was done by a certified wound consultant who, in accordance with diagnostic criteria described in the international guidelines, had more than 15 years of experience in diabetic foot care before treatment started.² Patients were included within 2 weeks after first presentation at the outpatient clinic with their foot complications. Neuropathy was assessed with a 10 g Semmes–Weinstein monofilament and peripheral arterial disease by assessment of pedal pulses and toe pressure. Diagnosis of osteomyelitis and Charcot foot was confirmed by the findings of the radiologist on X ray and magnetic resonance imaging. Presence of critical ischemia was confirmed by Doppler toe pressure measurements <30 mm Hg. Informed consent was obtained from all patients before the measurements. All research efforts were

in compliance with the World Medical Association's Declaration of Helsinki. The Medical Ethical Committee Twente approved the study protocol.

Patients were seated in supine position on a treatment bench. After shoes, socks, and (if applicable) dressings were removed, patients remained seated for a minimum of 5 min to allow equilibration of foot temperature. Pilot measurements showed no further changes in foot temperature after 5 min of rest. Patients were instructed to place their feet on support bars inside an experimental setup (Figure 1) in such a way that their shank and thigh remained supported on the treatment bench. The experimental setup comprised two cameras (one for color images, one for thermal images; specifications in Table 1), a light module, thermal reference elements, and foot supports. The light module consisted of eight LZ1-10WWW05 light-emitting diodes (LendEngin Inc.), each sized 4.4 × 4.4 mm. Thermal reference elements were six black blocks of 35 × 20 mm, with calibrated PT1000 resistor and heating resistors. The cameras, light module, and thermal references were connected to a desktop computer and a screen.

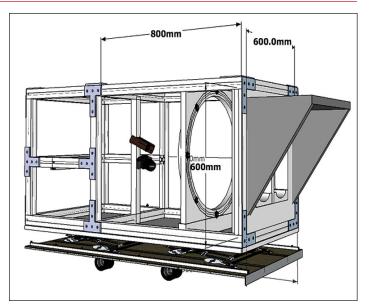


Figure 1. Schematic drawing of the interior of the experimental setup. The feet are positioned on the support bars, below the light shield, on the right side of the image. The thermal camera and the color image camera are placed 800 mm from the position of the feet, with the thermal camera above the color image camera. The light module is the circle between the cameras and the position of the feet, containing eight light-emitting diodes (black dots).

All parts of the system apart from the desktop computer and the screen were mounted in a wooden box sized $600 \times 600 \times 1900$ mm, with a light-shielding extension in front. Both shanks and thighs of the patient were covered with a sterile cloth. The entrance of the light-shielding extension of the box was further covered with a black cloth to eliminate any influence of ambient light conditions.

The color image camera was automatically focused during every measurement. The thermal camera was calibrated and focused at the start of each measurement day, using a plate covered with flat black spray paint that was positioned at the location of the feet, with the thermal reference elements above and beneath the plate. Calibration was performed based on the equal thermal distribution of the plate (room temperature). Additionally, temperature of the thermal reference elements was obtained during the measurements to ensure consistency of the thermal measurements during the day by comparing measured temperature values with registered temperature values of the reference elements.

Table 1. Specifications of Both Cameras in the Experimental Setup											
	Camera for color images	Thermal camera									
Camera type	Canon Eos 40D with EF-s 17-85 mm lens	FLIR SC305 with 16 bit resolution									
Resolution	APS-C size (22.2 × 14.8 mm)	320 × 240 pixels, 1.2 mm per pixel									
Sensor	10.5 mega pixel single plate complementary metal-oxide semiconductor sensor										
Angle of view	Horizontal: 68°40'–15°25' Vertical: 48–10°25' Diagonal: 78°30'–18°25'	25° × 19°; focal length 18 mm									
Field of view	420 × 280 mm	420 × 315 mm									
Thermal sensitivity	Not applicable	<0.05–30 °C									
Objective temperature range	Not applicable	-20 to 120 °C									
Computer interface	USB 2.0 high speed	Ethernet IEEE 802.3									

During each measurement, two images were acquired: one color image with all light sources on, followed by an infrared image with all light sources off. Both cameras were driven using custom-made MATLAB software (the Mathworks, MA). Data were processed in MATLAB. For live assessment of the patient's feet, the wound consultant annotated specific regions of interest (ROIs) with signs of diabetic foot complications (e.g., callus, ulcer) using a paper sheet on which the foot boundaries were drawn. In the color image, both the boundaries of the foot and the ROIs were manually annotated with self-designed MATLAB software (see **Figure 2**). This annotation was transferred to the thermal image. From the pixels encapsulated by the boundaries of the entire foot as well as those encapsulated by the ROIs, the mean temperature and the standard deviation (SD) across pixels were automatically processed using MATLAB.

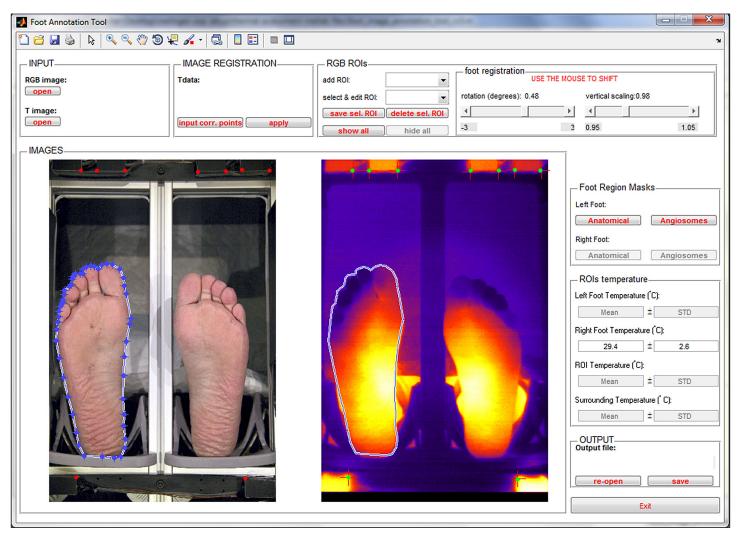


Figure 2. Screenshot of the manual annotation of the right foot in the color image and its subsequent transfer to the thermal image.

Results

Patient characteristics and temperature results from the infrared imaging are shown in **Table 2**. Mean (SD) number of pixels encapsulated by the feet boundary was 11,462 (1492); mean (SD) number of pixels encapsulated by the ROI was 82 (40). Thermal images are shown in **Figure 3** for the three subgroups of patients. Differences in mean temperature between the ipsilateral and contralateral foot in patients with no or local complications were at maximum 1.5 °C. Mean temperature between ipsilateral and contralateral foot of patients with diffuse complications differed at minimum 3 °C , where feet with osteomyelitis and/or Charcot feet were warmer and those with critical ischemia were colder compared with the contralateral foot.

In four out of five patients with local foot complications, temperature at the ROI was >2 °C higher compared with the corresponding region in the contralateral foot, and >2 °C higher compared with the mean temperature of the ipsilateral foot. In four out of five patients with diffuse complications, temperature at the ROI was >3 °C higher compared with the corresponding region in the contralateral foot. In these patients, the temperature difference between the ROI and the mean temperature of the ipsilateral foot was <1.5 °C.

	Table 2. Patient Characteristics and Temperature Values in Mean (SD) Degrees Celsius ^a													
Patient characteristics							Temperature (°C), mean (SD)							
#	M/F	Age	DM type	Neuropathy	PAD	Complications	Foot	Ipsilateral foot ^b	Contralateral foot	ΔT1	ROI ipsilateral foot	ROI contralateral foot	ΔΤ2	ΔΤ3
No c	No complications													
1	М	58	2	Yes	No	_		33.6 (1.4)	33.6 (1.4)	0.0				
2	F	36	1	No	No	_		29.6 (2.7)	29.4 (2.6)	0.2				
3	М	84	2	Yes	Yes	_		29.4 (1.8)	29.7 (1.1)	-0.3				
4	М	79	2	Yes	No	_		28.8 (1.7)	29.6 (1.6)	-0.8				
5	М	81	2	Yes	No	_		33.9 (1.9)	33.8 (1.0)	0.1				
Local complications ^c														
6	М	76	2	Yes	No	Ulcer hallux (1A)	Left	30.8 (2.4)	29.3 (2.0)	1.5	35.0 (0.6)	26.2 (0.7)	8.8	4.2
7	М	69	2	Yes	Yes	Ulcer hallux (1A)	Right	26.1 (1.4)	26.2 (1.4)	-0.1	28.9 (0.6)	24.9 (0.7)	4.0	2.8
8	М	49	2	Yes	No	Ulcer hallux (1A)	Right	29.5 (2.0)	29.1 (1.4)	0.4	32.7 (0.9)	31.5 (0.5)	1.2	3.2
9	М	68	2	Yes	No	Ulcer 2nd ray (1A) ^d	Left	30.8 (1.5)	30.2 (1.1)	0.6	33.1 (0.3)	30.6 (0.3)	2.5	2.3
10	F	67	2	Yes	No	Callus MTP2-4	Left	26.0 (1.1)	24.9 (0.7)	1.1	27.3 (0.1)	25.0 (0.2)	2.3	1.3
Diffu	se con	nplicat	ions ^{c,e}											
11	М	81	2	Yes	Yes	Critical ischemia Ulcer hallux (1C)	Right	25.1 (0.7)	29.0 (2.0)	-3.9	24.0 (0.1)	24.6 (0.1)	-0.6	-1.1
12	М	71	2	Yes	No	Charcot foot Ulcer hallux (1A)	Left Left	33.6 (1.1)	28.1 (1.4)	5.5	34.1 (0.3)	26.4 (0.3)	7.7	0.5
13	F	84	2	Yes	No	Ulcer MTP1 with osteomyelitis (3B)	Left	30.0 (1.5)	27.0 (1.4)	3.0	31.1 (0.5)	26.2 (0.1)	4.9	1.1
14	М	79	2	Yes	No	Charcot foot Ulcer lateral midfoot with osteomyelitis (3B)	Left Left	32.1 (1.9)	26.0 (1.2)	6.1	33.4 (0.3)	25.9 (0.3)	7.5	1.3
15	М	60	2	Yes	No	Ulcer MTP5 with osteomyelitis (3B)	Right	32.3 (1.0)	28.6 (1.0)	3.7	33.0 (0.5)	29.3 (0.3)	3.7	0.7

a #, patient number; M, male; F, female; DM, diabetes mellitus; MTP, metatarsophalangeal joint; PAD, peripheral arterial disease; ΔT1, difference between mean temperature of ipsilateral and contralateral foot; ΔT2, difference between mean temperature of ROI and corresponding contralateral ROI; ΔT3, difference between mean temperature of ROI and mean temperature of ipsilateral foot.

^b For patients without complications, left foot was defined as ipsilateral foot.

^c University of Texas wound classification system. ¹⁹

^d Only one complication of patient 9 is shown. In **Figure 3** it can be seen that another ROI (abundant callus on metatarsophalangeal joint 1) is present on the right foot. However, as there was no contralateral metatarsophalangeal joint 1 due to amputation, this ROI is not further analyzed.

^e The ROIs in patients with diffuse complications were their ulcer locations.

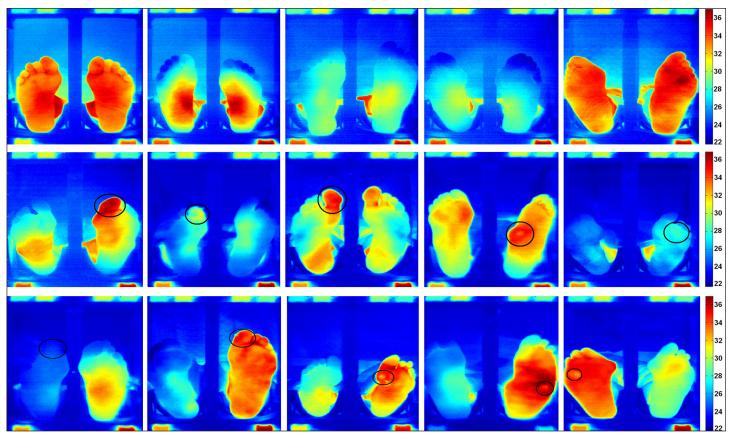


Figure 3. Thermal images of both feet of five patients without foot complications (top row, left to right, patients 1 to 5), five patients with local foot complications (middle row, left to right, patients 6 to 10), and five patients with diffuse foot complications (bottom row, left to right, patients 11 to 15). The ROIs are indicated with black circles drawn on top of the image. The six blocks shown along the perimeter in each image are the thermal references blocks.

Discussion

Technological advances in infrared imaging, concerning both the speed of assessment and the spatial resolution of image pixels, have increased possibilities to quantify thermal patterns and perform automated analysis on acquired thermal images of patients' feet.⁶ In the current study, we explored the first steps in the applicability of high-resolution infrared thermal imaging for noninvasive automated detection of signs of diabetic foot disease. An algorithm was developed for detecting signs of diabetic foot disease by measuring the temperature of the plantar surface of the feet, based solely on parameters that can be captured and analyzed with an infrared camera and a computer. With this algorithm, a good distinction could be made between patients having no diabetic foot complications, local complications, or diffuse complications. Patients without complications showed only small temperature differences between feet. Patients with local complications such as a noninfected and nonischemic foot ulcer or abundant callus showed locally increased temperatures of >2 °C compared with both the contralateral foot and the average temperature of the ipsilateral foot. Patients with diffuse complications such as a foot ulcer with osteomyelitis or a Charcot foot showed an increased mean temperature of >3 °C compared with the contralateral foot. These results indicate that advanced infrared thermal imaging may be applicable as diagnostic tool for noninvasive automated detection of signs of diabetic foot disease. This may be applied for early detection and timely management of diabetic foot complications, which may contribute to the prevention of further, more devastating consequences.

In the only clinical study known to the authors that measured foot temperature in the diabetic foot, Lavery and coauthors define a difference of 4 °F (or 2.2 °C) between a foot region and the corresponding region in the contralateral foot as clinically significant. The temperature differences measured in the current study confirm this threshold as clinically relevant. However, from the results of this study, it can be seen that more advanced infrared cameras

allow further specification of temperature differences between feet, where temperature difference thresholds of 2 °C apply to local complications such as neuropathic ulcers and abundant callus, and temperature difference thresholds of 3 °C apply to diffuse complications such as Charcot foot, ulcers with osteomyelitis, and critical ischemia. Further testing in larger groups of unselected patients is necessary to confirm the findings of this pilot study, to refine the classification of complications based on measured temperature differences, and to calculate diagnostic accuracy with parameters such as sensitivity and specificity.

The necessity for manual annotation of the boundaries of the foot in the color image was a limitation in this study. It is unlikely that manual annotation of foot boundaries has affected the results, as adequate accuracy could be guaranteed (Figure 2). However, automated analysis is not possible when all feet require manual annotation. We are currently working on automated image analysis similar to an already-described method.²⁰ This method includes automated definition of foot boundaries, calculation of mean temperatures, and comparison of temperatures with contralateral regions. These developments are needed to achieve our goal of an intelligent telemedicine monitoring system based on infrared imaging. Inclusion in this study was limited to patients either with or without existing pathologies. Future studies should follow patients without existing pathologies over time to investigate the diagnostic accuracy of the system in detecting diabetic foot complications as early as possible. Another limitation was the rather rudimentary differentiation in "no," "local," and "diffuse" complications. The local complications "neuropathic ulcer" and "abundant callus" have a different clinical significance, and therefore different referral times, but these signs could not be separated from the thermal images obtained in this study. Future studies need to explore if further differentiation is possible between these signs of diabetic foot disease based on thermal images.

Infrared temperature measurements have some limitations when applied for clinical purposes, which have been described earlier.^{5,21} The first is the detection of local complications that are bilaterally present in the same foot region at the same time. This is visible, for example, in patient 8, who had an ulcer with local temperature increase at the right hallux but also increased temperature at the left hallux. As a result, the temperature difference between these regions did not exceed 2 °C . As shown in this study, this limitation can be overcome with further optimization of the algorithms based on the comparison of temperature at the ROI with the mean ipsilateral foot temperature. The second limitation is the detection of diffuse complications present in both feet at the same time. Patient 5 had temperature values in both feet that are higher compared with the values measured in other patients. Based on the infrared image only, it is not possible to confirm whether this patient has bilaterally Charcot feet, bilaterally osteomyelitis, or just a pair of warm feet (e.g., due to the presence of autonomic neuropathy). By combining infrared imaging with, for example, photographic imaging, this limitation may be overcome, although it must be noted that the chances of having such severe complications on both feet at the same time are very low. Finally, the value of using absolute foot temperature values for the detection of signs of foot disease is still not clear. Foot temperatures may vary from person to person as a result of age- and sex-related differences, presence of autonomic neuropathy or peripheral vascular disease, and environmental factors such as ambient temperature.⁵ Properly controlled studies with advanced infrared imaging in large groups of participants are needed to determine the (additional) value of absolute foot temperature values for diagnostic purposes. Such studies preferably conduct measurements over time within patients to determine intraindividual temperature patterns and changes.

An intelligent telemedicine monitoring system as envisioned in our project is not yet close to being used in daily clinical practice. Technological issues need to be resolved, including patient positioning, camera positioning, the need for adding other imaging modalities, and automated image registration and analysis.⁶ Feasibility studies are needed to establish the most optimal requirements for such a system and the most effective application in daily life. Subsequently, the (cost) effectiveness of using such a system for the prevention of diabetic foot disease will have to be assessed. Prices of advanced thermal imaging systems are dropping, but it is not clear whether prices are low enough to implement such a system as a monitoring tool.

Conclusions

In this study, we explored the first steps in the applicability of infrared thermal imaging for noninvasive automated detection of signs of diabetic foot disease. We have found an algorithm that can detect signs of diabetic foot disease

and discriminate between no, local, or diffuse diabetic foot complications. This algorithm is based solely on parameters that can be captured and analyzed with an infrared camera and a computer. As such, an intelligent telemedicine monitoring system is one step closer. Future studies are essential to confirm and extend these promising early findings.

Funding:

This project is supported by public funding from Zon-MW, the Dutch Organisation for Health Research and Development (project ID 40-00812-98-09031).

Acknowledgments:

The authors acknowledge Marvin Klein and Tim Op't Root, Demcon Advanced Mechatronics b.v., Enschede, for their assistance in calibrating the thermal camera and the thermal references and Geert Jan Laanstra, University of Twente, for his assistance in building the experimental setup.

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