# Clinical Evaluation of a Microwave-Based Device for Detection of Traumatic Intracranial Hemorrhage

Johan Ljungqvist,<sup>1,2</sup> Stefan Candefjord,<sup>3–5</sup> Mikael Persson,<sup>3,4</sup> Lars Jönsson,<sup>6</sup> Thomas Skoglund,<sup>1,2</sup> and Mikael Elam<sup>4,7</sup>

# Abstract

Traumatic brain injury (TBI) is the leading cause of death and disability among young persons. A key to improve outcome for patients with TBI is to reduce the time from injury to definitive care by achieving high triage accuracy. Microwave technology (MWT) allows for a portable device to be used in the pre-hospital setting for detection of intracranial hematomas at the scene of injury, thereby enhancing early triage and allowing for more adequate early care. MWT has previously been evaluated for medical applications including the ability to differentiate between hemorrhagic and ischemic stroke. The purpose of this study was to test whether MWT in conjunction with a diagnostic mathematical algorithm could be used as a medical screening tool to differentiate patients with traumatic intracranial hematomas, chronic subdural hematomas (cSDH), from a healthy control (HC) group. Twenty patients with cSDH and 20 HC were measured with a MWT device. The accuracy of the diagnostic algorithm was assessed using a leave-one-out analysis. At 100% sensitivity, the specificity was 75%—i.e., all hematomas were detected at the cost of 25% false positives (patients who would be overtriaged). Considering the need for methods to identify patients with intracranial hematomas in the prehospital setting, MWT shows promise as a tool to improve triage accuracy. Further studies are under way to evaluate MWT in patients with other intracranial hemorrhages.

**Keywords:** chronic subdural hematoma; intracranial hemorrhage detection; microwave technology; traumatic brain injury; triage

# Introduction

**E** ARLY DETECTION AND EVACUATION of space-occupying intracranial hematomas is one of the cornerstones in the treatment of patients with traumatic brain injury (TBI). Seelig and associates<sup>1</sup> showed that in patients with traumatic acute subdural hematomas, the delay from injury to operation was the factor of greatest therapeutic importance. Diagnosis and removal of the hematoma within four hours of injury considerably reduced death—i.e., from 90% to 30% mortality rate (n=82, p<0.0001). Any further delay in hematoma evacuation severely increased death and worsened functional outcome in the patients who survived.<sup>1</sup> A key to improve outcome for patients with TBI is to reduce the time to definitive care by achieving high triage accuracy. Unfortunately, this is not always attained in contemporary emergency care. Xiang and colleagues<sup>2</sup> showed that more than one third of patients with major trauma (Injury Severity Score [ISS]  $\geq$ 16) in the United States were undertriaged, with TBI constituting >40% of undertriaged diagnoses, and intracranial hemorrhage being topranked. Haas and coworkers<sup>3</sup> showed that death was almost 25% higher for patients transported to a non-trauma center compared with direct transport to a trauma center (n = 11,398, odds ratio 95%, confidence interval 1.10–1.40). Transporting all patients with suspected TBI to a center with neurosurgical expertise, however,

<sup>&</sup>lt;sup>1</sup>Department of Neurosurgery, Sahlgrenska University Hospital, Gothenburg, Sweden.

<sup>&</sup>lt;sup>2</sup>Institute of Neuroscience and Physiology, Department of Clinical Neuroscience, The Sahlgrenska Academy at the University of Gothenburg, Gothenburg, Sweden.

<sup>&</sup>lt;sup>3</sup>Department of Signals and Systems, Chalmers University of Technology, Gothenburg, Sweden.

<sup>&</sup>lt;sup>4</sup>MedTech West, Sahlgrenska University Hospital, Gothenburg, Sweden.

<sup>&</sup>lt;sup>5</sup>SAFER Vehicle and Traffic Safety Centre at Chalmers, Gothenburg, Sweden.

Departments of <sup>6</sup>Neuroradiology and <sup>7</sup>Clinical Neurophysiology, Sahlgrenska University Hospital, Gothenburg, Sweden.

<sup>©</sup> Johan Ljungqvist et al., 2017; Published by Mary Ann Liebert, Inc. This Open Access article is distributed under the terms of the Creative Commons License (http://creativecommons.org/licenses/by/4.0), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly credited.

results in substantial overtriage, which addresses the need for reliable TBI diagnosis at the scene of injury.<sup>4</sup>

Computed tomography (CT) is the gold standard for detection of intracranial hematomas. In most cases, however, the patient must wait until arrival at a hospital with access to radiology facilities before a CT scan can be performed. A compact system that can detect intracranial hemorrhage in a pre-hospital setting—e.g., in road and air ambulances—could improve triage accuracy and reduce the time between injury and operation, resulting in reduced mortality rates and improved functional outcomes. Several different technologies have been investigated with the aim to develop such a system.<sup>5–8</sup>

Microwave technology (MWT) for biomedical applications has been explored for more than three decades.<sup>9</sup> Driving forces include the potential to realize portable devices at low cost to convey diagnostic information in a fast, non-invasive, and safe manner. This can be accomplished by employing non-ionizing microwave radiation with low power in conjunction with effective mathematical algorithms for signal processing. Because of the scattering nature of microwaves propagating in inhomogeneous media such as tissue, computationally demanding algorithms are required to process the data. Previous lack of sufficient computational power is one reason for the delay in introducing MTW in clinical settings.

During the last decade, clinically relevant results have been realized, mainly for breast cancer.<sup>10–12</sup> MWT can detect lesions such as cancer and internal bleedings because of the dielectric contrast between tissue types.<sup>13,14</sup> For detection of intracranial hemorrhage, the contrast between blood and brain matter is utilized.<sup>15</sup> In neurosurgical care, MWT could be used to monitor patients with conservatively managed hematomas, to monitor patients postoperatively, and to monitor patients with trauma in neurointensive care who are at risk of progressing contusions or extracerebral hematomas.

Recently, Persson and associates<sup>15</sup> showed that MWT can differentiate hemorrhagic and ischemic stroke. They used two MWT prototype systems to measure 20 and 25 stroke patients, respectively, in the first two proof-of-principle clinical studies. A machine-learning approach was used to differentiate the two patient groups—i.e., a classifier was derived from supervised (patient diagnosis is known) training on the patient measurements and evaluated using a so-called leave-one-out (LOO) analysis.

Encouraging results were presented, achieving areas under the receiver operating characteristic (ROC) curve (AUC) of 0.88 and 0.85 for the first and second clinical trial, respectively. Sensitivity

and specificity depend on the classifier threshold (decision offset). For example, at 90% sensitivity for detection of hemorrhagic stroke, the specificity was 65% for the second clinical study.<sup>15</sup> The ability of a device to differentiate hemorrhagic and ischemic stroke in the pre-hospital setting could allow for rapid thrombolytic therapy in patients with ischemia and more adequate care for patients with intracerebral hematomas.

The purpose of the current clinical investigation was to test whether MWT, using the first portable device enabling pre-hospital measurements, could be used as a medical screening tool to differentiate patients with a traumatic intracranial hematoma from a healthy control (HC) group. Because this is the first study using MWT to examine patients with trauma, we chose to include patients with chronic subdural hematomas (cSDH), which is an intracranial hemorrhage usually not necessitating immediate management. A cSDH is a collection of blood and blood breakdown products between the surface of the brain and the dura. It is often caused by a minor head injury, expands slowly, and symptoms can take weeks to appear.<sup>16</sup> Large or symptomatic hematomas are usually considered indications for surgical evacuation.<sup>16</sup> By studying patients with cSDH, we aimed to test the viability of MWT for hematoma detection, in terms of sensitivity and specificity, compared to the CT scan as the gold standard.

# **Patients and Methods**

## Study subjects

This study was approved by the Regional Ethical Review Board at the University of Gothenburg, Sweden, and reviewed by The Medical Products Agency - Sweden. It was conducted according to Good Clinical Practice, the revised Declaration of Helsinki, and the ISO 14155:2011 standard. The study was registered at Clinical-Trials.gov (Identifier: NCT02282228) before the recruitment of the first study participant.

All patients were referred to Sahlgrenska University Hospital for operation of cSDH, during the period September 2015 to January 2016. The HC group was recruited in the same period as the patients and matched to the patient cohort for age and sex. Written informed consent was obtained from all participants before any study-related procedure was initiated. Safety follow-up for participants was performed >12 h after the diagnostic procedure. The inclusion and exclusion criteria are shown in Table 1.

Inclusion criteria patients	Inclusion criteria controls	Exclusion criteria patients and controls			
Admitted for surgery of cSDH CT brain scan within 96 h	Healthy—i.e., no significant medical history ≥18 years of age	Pregnant or breastfeeding women Shunt or other foreign object implanted in the brain			
≥18 years of age	Signed a written informed consent	Participation in any other clinical study that could interfere with the result in the ongoing study			
Be able to have a normal conversation and understand the information about the study, corresponding to Glasgow Coma Scale (Verbal Response) of 5					
Signed a written informed consent					

TABLE 1. INCLUSION AND EXCLUSION CRITERIA FOR PATIENTS AND CONTROLS

cSDH, chronic subdural hematoma; CT, computed tomography.

## Measurements

Eligible patients were included in the study on arrival at the neurosurgical unit. They were measured with the microwave device (Strokefinder MD100, Medfield Diagnostics AB, Gothenburg, Sweden) before operation of cSDH. Measurements were performed with the subjects lying in a hospital bed. A thin disposable plastic protective cover (evercare<sup>®</sup> Banded Bag - REF 1855 - Ø 140 cm, OneMed Group Oy, Helsinki, Finland) was mounted around the device for hygienic reasons before the subject's head was positioned in the device. The subjects were required to lie still for the duration of the measurement (approximately 45 sec). No significant movements were visually observed during any subject measurements. Two investigators performed all measurements.

The Strokefinder MD100 is designed like a headrest for placement on a hospital bed or ambulance stretcher (Fig. 1). The device has eight antennas mounted in four pairs, where the pair in contact with the back of the patient's head is mounted at the bottom, and the other three pairs are mounted on separate arms. When the patient's head has been positioned in the device, the fastening mechanism is tightened until sufficient antenna contact with the head is achieved, without causing discomfort to the subject. The investigators followed a standardized procedure to position the patient's head, and carefully inspected that the head was placed symmetrically in the device. The measurements were started from a tablet computer, which was connected wirelessly to the main unit. The proprietary software included a test verifying that all antennas achieved good contact with the subject's head. If the test showed that one or more antennas did not achieve good contact, the subject's head was repositioned and the antenna positions and contact pressure controlled until the test was approved. The device automatically performed three consecutive measurements during the diagnostic procedure.

## CT-scan assessment

The patients' CT-scans were reviewed. Volume and attenuation of the hematomas and midline shift were measured. The volume of the hematomas was estimated by delineating the hematomas manually using the ITK-SNAP software (Version 3.4.0, University of Pennsylvania), and the software then automatically calculated the volume. A neuroradiologist (author LJ) then measured the at-



**FIG. 1.** The Strokefinder MD100 device (Medfield Diagnostics AB, Gothenburg, Sweden). Reprinted with permission.

tenuation of the hematomas and confirmed the accuracy of the volume and midline shift measurements.

#### Microwave data pre-processing and analysis

The raw microwave data consisted of all antenna combinations (channels), including both reflection channels (same antenna sending and receiving) and transmission channels (one antenna sending, the other antennas receiving). The full frequency range was approximately 0.1–1.95 GHz. The raw data were preprocessed—i.e., prepared and transformed into a format suitable for the diagnostic algorithm, by excluding channels with high attenuation (i.e., low signal-to-noise ratio, because of a relatively long direct path through the brain) and channels that measured more peripheral regions relative to the commonly lateral location of cSDH. Figure 2 illustrates the excluded channels. For each measurement, all selected frequencies of the retained channels were combined into one complex vector. The three measurements on each subject were averaged into one mean measurement. No further pre-processing of the raw data was performed.

The classifier developed by Persson and coworkers<sup>15</sup> was used on the pre-processed data. A LOO cross-validation procedure was used i.e., the subject measurement to be classified was not included in the training data—to avoid overfitting. The classifier performance depends on which so-called subspace dimensions are retained.<sup>15</sup> A repeated LOO procedure was used to identify the subspace dimensions and frequency interval that yielded optimal classifier performance.

The diagnostic performance was evaluated using the ROC and the AUC. An AUC of  $\sim 0.5$  represents a useless diagnostic test, equal to relying on chance. An AUC of 1.0 represents a perfect test that classifies all subjects correctly. The specificity at 100% sensitivity was derived from the ROC. A scatter plot was used to show



**FIG. 2.** The reflection and transmission coefficients for antennas 1 and 2 (at subject's forehead) and antennas 7 and 8 (at back of subject's head) were removed, except for channels between the lateral antennas (3 to 6) and forehead/back of head antennas. The dashed lines indicate the channels that were removed.

the classifier decision value for all subjects.<sup>15</sup> The frequency was swept from 0.1-1.95 GHz with 50 MHz step-size and a minimum frequency interval of 400 MHz. The highest AUC on average for all frequency intervals was given by keeping only the first subspace dimension, and this classifier setting was therefore used throughout all tests in this study. The frequency interval 0.75-1.95 GHz yielded the highest specificity at 100% sensitivity and was therefore used throughout all tests in this study.

To test the robustness of the classification with the selected preprocessing and classification parameter settings, 100 repeated LOO procedures were performed on data sets where a few random subjects were removed each time. We chose to remove two random subjects from the full data set for each iteration. The mean and standard deviation of the AUC were calculated from the 100 iterations. If the mean AUC is close to the AUC for the full data set and the standard deviation is relatively small, this indicates that the selected parameter settings for the classification are robust-i.e., the result does not fluctuate substantially depending on the exact configuration of the data set.

To validate that the classifier did not become overfitted (model being fitted to irrelevant information/noise) to the data, 100 repeated LOO procedures were performed on data sets where the subjects were randomly assigned to one of the two classes-i.e., each subject was assigned to either the cSDH group or the HC group regardless of the true diagnosis. For such random data sets, it is expected that the groups cannot be differentiated-i.e., an AUC  $\sim 0.5$  is expected. It is a useful check for bias of the mathematical model, which would cause deviations from the expected performance.<sup>17</sup> The mean and standard deviation of the AUC were calculated from the 100 iterations.

Results

volume, attenuation, and midline shift for the patients. Eight female and 12 male patients were included, and the mean age for the patients was 75.6 years (range 54-90 years). The HC group consisted of nine females and 11 males with a mean age of 71.8 years (range 61–82 years). Figure 3 shows a representative example of a CT scan of a patient with cSDH.

Figure 4 shows the ROC curve for differentiating cSDH from HC. The AUC is 0.94, with a specificity of 75% at 100% sensitivity. Figure 5 shows the scatter plot.

Table 3 shows the results of the tests for robustness and bias of the classification.

## Discussion

This is the first clinical study testing the validity of MWT in identifying a traumatic intracranial lesion, cSDH. At 100% sensitivity, the specificity was 75%, which implies that the technique could be valuable for clinical triage of patients with suspected TBI.

The tests of robustness and bias of the classification indicate that the classifier was not overfitted to the data-i.e., the classification performance was good (AUC =  $0.90 \pm 0.03$ ) for data sets (n = 100) with true diagnosis for the subjects, and classification was equal to chance (AUC ~0.5) for data sets (n = 100) where subjects were randomly assigned to either the cSDH or HC group. This indicates that the MWT method with the classifier derived in this study would achieve similar performance on unseen data-i.e. on new subjects from the same populations.

### Pre-hospital screening of patients with possible TBI

There is an obvious need for a pre-hospital screening tool to identify patients with traumatic intracranial hematomas. Undert-Twenty patients with cSDH and 20 HC subjects were included in riage of patients with major trauma in general, and for severe TBI in particular, is a substantial problem.<sup>2,4,18</sup> This leads to patients with the study. Table 2 shows age, sex, main symptoms, hematoma

## TABLE 2. CHARACTERISTICS OF THE PATIENTS\*

\*Age, sex, main symptoms, hematoma volume, attenuation in Hounsfield units presented as an interval for patients with inhomogeneous hematomas, and midline shift.

	Age	Ser		iiematoma votume		Attenuation	Midline shift
Patient	(years)	(male/female)	Main symptoms	Right (mL)	Left (mL)	(HU)	(mm)
P1	63	М	Hemiparesis left side. Headache.	104	_	26	7
P2	90	F	Hemiparesis left side.	116	18	22-49	7
P3	81	М	Headache. Discrete dysphasia.	_	174	26-49	4
P4	67	М	Headache. Disturbed balance.	163	_	32-58	14
P5	87	М	Discrete hemiparesis right side.	_	67	24-54	1
P6	75	F	Discrete hemiparesis right side.	15	50	17-43	4
P7	86	М	Hemiparesis left side.	143	_	30	6
P8	67	М	Headache. Disturbed balance.	20	87	35-55	6
P9	81	Μ	Hemiparesis left side.	75	_	23-59	4
P10	76	F	Disturbed balance.	108	102	31-41	2
P11	65	Μ	Paresis right leg. Headache.	_	104	25-29	8
P12	67	М	Hemiparesis left side. Headache.	94	_	37-51	7
P13	88	F	Headache. Discrete dysphasia.	_	43	28-41	6
P14	63	М	Discrete dysphasia. Poor motor skills right hand.	_	114	50-61	8
P15	54	F	Headache.	27	_	30-39	4
P16	76	F	Headache.	39	22	22-54	0
P17	67	F	Discrete paresis left arm. Headache.	112	_	18	12
P18	86	М	Hemiparesis right side.	_	144	32-57	5
P19	88	F	Hemiparesis right side.	_	118	23-53	7
P20	85	М	Hemiparesis left side.	105	67	24-50	3



**FIG. 3.** A typical appearance of a cSDH on the left side (patient P3) on a computed tomography scan, with its characteristic crescent-shaped form spanning over the coronal and lambdoid sutural margins. The hematoma is in the hypodense phase. Notice also the significant midline shift.

major trauma receiving definitive care at non-trauma centers or delayed care at a trauma center because of need of transfer, both associated with increased mortality.<sup>3,19</sup> Studies show that it is common that a large proportion of patients with major trauma are first transported to non-trauma centers.<sup>3,18,20</sup>

Improving triage protocols to obtain higher triage accuracy for patients with suspected TBI is a major challenge. For example, Dehli and colleagues<sup>18</sup> found that the triage accuracy for major trauma (ISS >15) was almost the same, at an undertriage rate of 28%, also after a revision of the trauma team activation criteria, and that undertriaged patients had a higher frequency of neurosurgical injuries (p < 0.05). Another example is the study by Ashkenazi and associates<sup>21</sup> that evaluated whether Glasgow Coma Scale (GCS) score or the Simplified Motor Score could identify patients with severe TBI in need of neurosurgical intervention. The results were discouraging, because there was no statistically significant difference between the proportion of patients in need of neurosurgical procedures presenting with GCS scores of 3 to 8 and GCS scores of 9 to 14 (30% vs. 27%; p = 0.83).<sup>21</sup>

Near-infrared spectroscopy, as employed by the handheld Infrascanner device, measures optical density in brain regions and has been shown to be capable of identifying intracranial hematomas.<sup>6,22,23</sup> A sensitivity of 88% and specificity of 91% was demonstrated in a bi-institutional study for hematomas larger than 3.5 mL in volume and less than 2.5 cm from the surface of the brain (n = 365 patients, whereof 50 with hematoma), which was reduced to 69% sensitivity when all hematomas were considered (96/365 patients).<sup>22</sup> The disadvantages with the method are that nearinfrared light has a short tissue penetration depth, that the current



**FIG. 4.** The receiver operating characteristic curve and area under the curve (AUC) value for the leave-one-out cross-validation procedure.

configuration of distance between light source and detector limits detection to a depth of 2-3 cm, and that the device is unable to distinguish between intracranial and extracranial lesions such as periosteal hematomas.<sup>6,23</sup>

Another technology suggested for detection of intracranial hemorrhage is electroencephalography (EEG). Prichep and coworkers<sup>8</sup> showed in a study of 394 patients with mild TBI, of which 278 were CT-negative for hemorrhage and used as control subjects and 116 had hematomas whereof 46 were included in the study (hematoma >1 mL, mean volume 16.4 mL), that a TBI-Index



**FIG. 5.** Scatter plot of the classifier decision value for all subjects. The patients have been plotted in increasing order of total hematoma size (for patients with bilateral hematoma, the left and right side volumes were summarized) from left to right. The controls are plotted in chronological order from left to right. The dashed line shows the decision value for the classifier yielding 100% sensitivity at 75% specificity. The receiver operating characteristic curve (Fig. 4) was constructed by adjusting the decision value—i.e., moving the dashed line and calculating the sensitivity and specificity for all possible decision values.

#### EVALUATION OF A MICROWAVE-BASED DEVICE FOR TBI DETECTION

TABLE 3. RESULTS FOR TEST OF ROBUSTNESS AND BIAS OF THE CLASSIFICATION

Data sets	Mean AUC±SD
Remove two random subjects $(n=100)$	$0.90 \pm 0.03$
Random diagnosis $(n=100)$	$0.47 \pm 0.11$

AUC, area under the curve; SD, standard deviation.

for EEG had a sensitivity for hematoma detection of 96% at a specificity of 44%.<sup>8</sup> The performance was not influenced by the distance from the hematoma to the recording electrodes, nor by type or volume of hematoma.

The TBI-Index was derived in previous studies by employing a binary classification algorithm based on selected quantitative features from an EEG limited to five electrodes placed on the forehead. Compared with the Infrascanner, the sensitivity for EEG appears to be higher for small bleedings, and a larger penetration depth appears to be an advantage with EEG. The specificity of EEG is poor, however.

The microwave technique used in this study allows for a portable device to be used in a pre-hospital setting and to identify an intracranial hematoma at the scene of the injury, thereby enhancing early triage and allowing for more adequate early care. In the current pilot study, we found a specificity of 75% at a sensitivity of 100% for differentiating cSDH from HC. Transferring these results to a pre-hospital setting means that all patients with a significant intracranial hemorrhage would be detected. The rate of undertriage and the time to possible neurosurgical intervention for patients with TBI could thus be reduced.

The cost for detecting all patients with hemorrhages would be 25% false positives—i.e., some patients would be overtriaged. When compared with current clinical practice, however, exemplified by the results from Lecky and associates,<sup>4</sup> presenting an "overtriage ratio of 13:1 for neurosurgery and 4:1 for TBI," these results are not discouraging. Moreover, MWT has the potential to be used in hospitals to reduce the amount of unnecessary CT scans for patients with mild TBI; to monitor patients in the neurosurgical intensive care unit—e.g., to follow the progression of hematomas.<sup>7</sup>

In the future, it may also be possible to image the brain and visualize hemorrhage in real time.<sup>24</sup> Currently, MWT images do not provide detailed anatomical information compared with CT, and the time required to derive an image is too long for field use without employing *a priori* information about the patient, such as a previous magnetic resonance (MR) image.<sup>25</sup> Imaging methods for MWT typically require hours to produce an image, although development of faster algorithms is ongoing.<sup>26,27</sup> In contrast, the classification approach used in the present study is fast, giving a result within seconds. The main advantages with using a diagnostic algorithm is that results are presented in real time, and that no operator image interpretation is necessary.

# Limitations of the study

Because of limitations in the current study, further trials are needed before the value of MWT for pre-hospital triage of TBI can be assessed fully. Here, we have included only patients with cSDH, a diagnosis seldom seen in the pre-hospital emergency setting. Because this was the first study of patients with traumatic intracranial hemorrhage, we focused on patients who did not need immediate neurosurgical intervention. Obviously, for the acute trauma setting, it would be more interesting to include patients with acute hematomas. Further studies are under way to test the device in patients with acute hematomas (e.g., ClinicalTrials.gov, identifier: NCT02728908). Further, to work properly in a clinical setting, the device must also be tested for patients with other intracranial pathologies (e.g., hydrocephalus) or foreign objects implanted (e.g., shunts or aneurysm clips), which were excluded in this investigation.

The cSDH in the current study were all large (mean total hematoma volume [left and right side summed if bilateral] = 112 mL), because of the study design of recruiting patients admitted for surgery of cSDH, and usually acute intracranial hemorrhages are smaller. This raises the question whether the device would miss smaller hematomas. The cSDH in the current study showed a large variability in attenuation (Table 2), because of different amounts of acute blood, blood breakdown products, and membranes. This means that the dielectric properties of cSDH vary. Although the cSDH in this study are large, their heterogeneous composition may make them more difficult to detect than acute hematomas. Future studies are needed to assess the dielectric properties of different types of brain hemorrhage.

Further, the concept study by Candefjord and colleagues,<sup>7</sup> using tests on a phantom of subdural hematoma and numerical simulations, shows that the classifier requires a training data set size in the order of 100 patients and 100 control subjects to achieve high accuracy, because of high patient intervariability regarding factors such as head size.<sup>7</sup> This indicates that a larger clinical study would allow for developing a diagnostic algorithm with capacity to detect all clinically significant hematomas, without causing a large number of false positives. The first clinical study showing that MWT can differentiate hemorrhagic and ischemic stroke, where hematoma volumes ranged from under 1 mL to 280 mL, further supports this notion.<sup>15</sup>

Numerical simulations have shown that MWT can be valuable for estimating the size and position of the hematoma.<sup>7,28</sup> In the current study, no clear relation between decision value and hematoma volume was found (cf. Fig. 3), but such a relationship would be expected in a large clinical study of acute traumatic intracranial hemorrhage.

Those in the HC group were classified as "healthy" because they had no significant medical history and showed no signs of neurologic disorder. The HC subjects, however, could still have intracranial pathology (including cSDH) because no imaging was available for comparison. The nature of the investigation did not allow for blinding of the patient or the examiner.

The diagnostic algorithm has not been evaluated in an independent patient cohort in this pilot study. Although tests of robustness and bias have been performed and indicate that the results would be applicable to a new patient cohort, future prospective studies are needed to confirm the validity of MWT in conjunction with a diagnostic algorithm on unseen patients.

#### Conclusion

This is the first clinical study testing the validity of MWT in detecting a traumatic intracranial lesion (cSDH). At 100% sensitivity, the specificity was 75%. The device is portable and takes measurements in 45 sec, which allows for pre-hospital use. The results show promise for the device to enhance triage, aid in decision making in the emergency department, and to provide additional information in monitoring of patients in the intensive care unit. Further investigations are under way to test the capacity of the device to identify different other intracranial lesions.

#### **Author Disclosure Statement**

M.P. is founder and main owner of Medfield Diagnostics AB. M.E. serves as unpaid consultant to Medfield Diagnostics AB. For the remaining authors, no other competing financial interests exist.

#### Acknowledgment

The authors would like to thank Dr. Andreas Bartley and Gudrun Barrows for assisting with clinical examination and data collection. The authors would like to thank David Andtbacka and Lukas Lönnroth for assisting with CT scan assessment. This study was supported by the Swedish Research Council (proj no. 921-2014-7116), the Gothenburg medical faculty (ALFGBG 542231) and the Chalmers Innovation Office (proj no. V126).

### References

- Seelig, J.M., Becker, D.P., Miller, J.D., Greenberg, R.P., Ward, J.D., and Choi, S.C. (1981). Traumatic acute subdural hematoma: major mortality reduction in comatose patients treated within four hours. N. Engl. J. Med. 304, 1511–1518.
- Xiang, H., Wheeler, K.K., Groner, J.I., Shi. J., and Haley, K.J. (2014). Undertriage of major trauma patients in the U.S. emergency departments. Am. J. Emerg. Med. 32, 997–1004.
- Haas, B., Gomez, D., Zagorski, B., Stukel, T.A., Rubenfeld, G.D., and Nathens, A.B. (2010). Survival of the fittest: the hidden cost of undertriage of major trauma. J. Am. Coll. Surg. 211, 804–811.
- Lecky, F., Russell, W., Fuller, G., McClelland, G., Pennington, E., Goodacre, S., Han, K., Curran, A., Holliman, D., Freeman, J., Chapman, N., Stevenson, M., Byers, S., Mason, S., Potter, H., Coats, T., Mackway-Jones, K., Peters, M., Shewan, J., and Strong, M. (2016). The Head Injury Transportation Straight to Neurosurgery (HITS-NS) randomised trial: a feasibility study. Health Technol. Assess. 20, 1–198.
- Mobashsher, A.T., Bialkowski, K.S., Abbosh, A.M., and Crozier, S. (2016). Design and experimental evaluation of a non-invasive microwave head imaging system for intracranial haemorrhage detection. PLoS One 11:e0152351.
- Leon-Carrion, J., Dominguez-Roldan, J.M., Leon-Dominguez, U., and Murillo-Cabezas, F. (2010). The Infrascanner, a handheld device for screening in situ for the presence of brain haematomas. Brain Inj. 24, 1193–1201.
- Candefjord, S., Winges, J., Malik, A.A., Yu, Y., Rylander, T., McKelvey, T., Fhager, A., Elam, M., and Persson, M. (2016). Microwave technology for detecting traumatic intracranial bleedings: tests on phantom of subdural hematoma and numerical simulations. Med. Biol. Eng. Comput. E-pub ahead of print.
- Prichep, L.S., Naunheim, R., Bazarian, J., Mould, W.A., and Hanley, D. (2015). Identification of hematomas in mild traumatic brain injury using an index of quantitative brain electrical activity. J. Neurotrauma 32, 17–22.
- Lin, J.C., and Clarke, M.J. Microwave imaging of cerebral edema. (1982). Proc. IEEE 70, 523–524.
- Meaney, P.M., Golnabi, A.H., Epstein, N.R., Geimer, S.D., Fanning, M.W., Weaver, J.B., and Paulsen, K.D. (2013). Integration of microwave tomography with magnetic resonance for improved breast imaging. Med. Phys. 40, 103101.
- Poplack, S.P., Tosteson, T.D., Wells, W.A., Pogue, B.W., Meaney, P.M., Hartov, A., Kogel, C.A., Soho, S.K., Gibson, J.J., and Paulsen, K.D. (2007). Electromagnetic breast imaging: results of a pilot study in women with abnormal mammograms. Radiology 243, 350–359.
- Preece, A.W., Craddock, I., Shere, M., Jones, L., and Winton, H.L. (2016). MARIA M4: clinical evaluation of a prototype ultrawideband radar scanner for breast cancer detection. J. Med. Imaging (Bellingham) 3, 033502.
- Gabriel, C., Gabriel, S., and Corthout, E. (1996). The dielectric properties of biological tissues: I. Literature survey. Phys. Med. Biol. 41, 2231–2249.

- Gabriel, S., Lau, R, and Gabriel, C. (1996). The dielectric properties of biological tissues: II. Measurements in the frequency range 10 Hz to 20 GHz. Phys. Med. Biol. 41, 2251–2269.
- Persson, M., Fhager, A., Trefna, H., Yu, Y., McKelvey, T., Pegenius, G., Karlsson, J.E., and Elam, M. (2014). Microwave-based stroke diagnosis making global prehospital thrombolytic treatment possible. IEEE Trans. Biomed. Eng. 61, 2806–2817.
- Ducruet, A.F., Grobelny, B.T., Zacharia, B.E., Hickman, Z.L., De-Rosa, P.L., Andersen, K.N., Sussman, E., Carpenter, A., and Connolly, E.S. (2012). The surgical management of chronic subdural hematoma. Neurosurg. Rev. 35, 155–169.
- Parker, B.J., Günter, S., and Bedo, J. (2007). Stratification bias in low signal microarray studies. BMC Bioinformatics 8, 326.
- Dehli, T., Monsen, S.A., Fredriksen, K., and Bartnes, K. (2016). Evaluation of a trauma team activation protocol revision: a prospective cohort study. Scand. J. Trauma Resusc. Emerg. Med. 24, 105–111.
- MacKenzie, E., Rivara, F., Jurkovich, G., Nathens, A., Frey, K., Egleston, B., Salkever, D., and Scharfstein, D. (2006). A national evaluation of the effect of trauma-center care on mortality. N. Engl. J. Med. 354, 366–378.
- Candefjord, S., Buendia, R., Caragounis, E.C., Sjöqvist, B.A., and Fagerlind, H. (2016). Prehospital transportation decisions for patients sustaining major trauma in road traffic crashes in Sweden. Traffic Inj. Prev. 17, Suppl 1, 16–20.
- 21. Ashkenazi, I., Schecter, W.P., Peleg, K., Givon, A., Olsha, O., Turegano-Fuentes, F., Alfici, R., and the Israeli Trauma Group, Bahouth, H., Becker, A., Ben Ely, M., Braslavsky, A., Jeroukhimov, I., Qarawany, M., Kessel, B., Klein, Y., Lin, G., Merin, O., Bala, M., Mnouskin, Y., Rivkind, A.I., Shaked, G., Soffer, D., Stein, M., and Weiss, M. (2016). Glasgow Coma Scale Score in survivors of explosion with possible traumatic brain injury in need of neurosurgical intervention. JAMA Surg. 151, 954–958.
- Robertson, C.S., Zager, E.L., Narayan, R.K., Handly, N., Sharma, A., Hanley, D.F., Garza, H., Maloney-Wilensky, E., Plaum, J.M., Koenig, C.H., Johnson, A., and Morgan, T. (2010). Clinical evaluation of a portable near-infrared device for detection of traumatic intracranial hematomas. J. Neurotrauma 27, 1597–1604.
- Semenova, Zh.B., Marshintsev, A.V., Melnikov, A.V., Meshcheryakov, S.V., Adayev, A.R., and Lukyanov, V.I. (2016). Infrascanner in the diagnosis of intracranial lesions in children with traumatic brain injuries. Brain Inj. 30, 18–22.
- Mohammed, B.J., Abbosh, A.M., Mustafa, S., and Ireland, D. (2014). Microwave system for head imaging. IEEE Transactions on Instrumentation and Measurement 63, 117–123.
- Mahmood, Q., Li, S, Fhager, A., Candefjord, S., Chodorowski, A., Mehnert, A., and Persson, M. (2015). A comparative study of automated segmentation methods for use in a microwave tomography system for imaging intracerebral hemorrhage in stroke patients. J. Electromag. Anal. Appl. 7, 152–167.
- Fhager, A., Padhi, S.K., and Howard, J. (2009). 3D Image reconstruction in microwave tomography using an efficient FDTD model. IEEE Ant. Wireless Propag Lett 8, 1353–1356.
- Bonazzoli, M., Dolean, V., Rapetti, F., and Tournier, P.H. (2016). Parallel preconditioners for high order discretizations arising from full system modeling for brain microwave imaging. Int. J. Numer. Model 00, 1–10.
- Candefjord, S., Winges, J., Yu, Y., Rylander, T., and McKelvey, T. (2013). Microwave technology for localization of traumatic intracranial bleedings—a numerical simulation study. Presented at the 35th Annual International Conference of the IEEE EMBS, Osaka, Japan, 3– 7 July, 2013, 1948–1951.

Address correspondence to: Johan Ljungqvist, MD Department of Neurosurgery Sahlgrenska University Hospital SE-413 45, Goteborg Sweden

E-mail: johan.ljungqvist@vgregion.se