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New advances in mechanomyography sensor technology and signal processing: validity and intrarater reliability of recordings from muscle.

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Abstract

Introduction

The M-Mark project aims to develop a device incorporating wearable sensors for arm rehabilitation following stroke. These will record kinematic activity using inertial measurement units (IMU) and mechanical muscle activity. The gold standard for measuring muscle activity is electromyography (EMG); however, mechanomyography (MMG) offers an appropriate alternative for our home-based rehabilitation device. We have patented a new laboratory-tested device that combines an IMU with MMGs. We report on the validity and reliability of the MMGs against EMG sensors.

Methods

In 18 healthy adults (27-82 years), MMG and EMG recordings were taken from the forearm flexor and extensor muscles during voluntary contractions. Isometric contractions were performed at different percentages of maximal force to examine the validity of MMG. Root-mean-square (RMS) of MMG and EMG was measured during one second epochs of isometric flexion and extension. Dynamic contractions were recorded during a tracking task on two days, one week apart, to examine reliability of muscle onset timing.

Results

Reliability of MMG onset was high (ICC 0.78) and was comparable with EMG (ICC 0.79). The correlation between force and MMG was high ($R^2 = 0.94$).

Conclusion

The MMG device records valid and reliable signals of mechanical muscle activity on different days.

Introduction

The ability to measure muscle activity to aid recovery in the home environment may enhance self-management in neurological rehabilitation. An interactive system, Mechanical Muscle Activity with Real-time Kinematics (M-MARK), is being developed to aid recovery of function after stroke\(^1\). The M-Mark system is a home-based class-one medical device for stroke upper-limb rehabilitation. The system incorporates wearable sensors for arm rehabilitation at home. These will record kinematic activity using inertial measurement units (IMUs) and mechanical muscle activity using mechanomyography (MMG) to assess the quality of movement of the stroke-affected upper-limb as individuals perform arm tasks related to activities of daily living.

The IMU sensors are connected by poppers to a light, breathable garment developed with extensive end user testing. The position of the MMGs is initially determined by a therapist performing a clinical assessment of the muscle body location and choosing from an array of pre-defined holes within the garment. This is to ensure that the MMG is accurately placed on the relevant muscle body for each individual. Once the position is determined by the therapist, a simple clip is placed into the relevant holes and remains
there for subsequent use. The person with stroke can then easily attach and detach the MMG sensors via a simple pull string and clip in mechanism. The system was specifically designed together with people who have had a stroke. This ensured a high level of usability which is essential for a home based rehabilitation system.

Electromyography (EMG) for recording electrical muscle activity has been available for many years but has several limitations for use outside the clinical environment. Mechanomyography (MMG) is an alternative to EMG that measures muscle vibrations (i.e. mechanical activity) using a sensor, such as a microphone or accelerometer. Validity of MMG signals, in terms of recording known vibration frequencies, has been determined. Before MMG can be used in the M-MARK system, its validity and reliability of recording signals from muscles needs to be established.

The MMG field has a colourful history, which began in 1665 when Francesco Maria Grimaldi, a Jesuit priest and scientist, discovered that muscles make rumbling sounds. The field remains largely unrecognised and has been regularly rediscovered throughout the centuries. Much of the pioneering work on developing the MMG technique (formerly termed acoustic myography) was conducted by Dr Dan Barry, who was the first to demonstrate that MMG signals are generated by lateral oscillations of muscle fibres. He also investigated clinical applications of MMG, including muscle fatigue, aiding diagnosis of muscle disease and for controlling prostheses. In 1993, Orizio coined the term mechanomyography and reviews of the technique have since charted its development.

The MMG technique is easier to use than EMG because it does not require pre-amplification, coupling gel, direct skin contact or such precise positioning. MMG therefore offers more practical, efficient, hygienic, reusable implementation for real-world (out of clinic) use. However, technical limitations due to interference of signals from artefacts have limited the progress of MMG research and clinical applications until recently. Novel signal processing techniques have been developed, which include hardware and software filtering strategies, alongside feature ranking/selection algorithms to remove mechanical artefacts and isolate muscle activity in the MMG signal.

Following these technical advances in MMG hardware and software, their robustness in terms of validity and reliability need to be examined. Standardised protocols can be followed for testing MMG signals against known measures of force and EMG during isometric and dynamic contractions to confirm known force/MMG/EMG relationships. Reliability of repeated testing on different days is also important to examine, so that the degree of error can be factored into determining true change over time or in response to an intervention. The present study aimed to examine the validity and reliability of MMG signals recorded using novel sensor and signal processing techniques.
Methods

Study Design

The validation aspect of the study compared changes in MMG signals against EMG changes during different levels of force. The reliability aspect compared recordings made on two different days using a standardised protocol, in a test re-test reliability design.

Participants

A sample of convenience of 18 healthy adults aged 27-82 years (mean 44.2, SD = 16.7) were studied (n=7 males, n=11 females).

Exclusion criteria were: any musculoskeletal disorders or injuries, neurological or systemic conditions, skin disorders (e.g. psoriasis, allergies). Participants were recruited via various routes, including staff and students at the University, though a poster, from University of Southampton healthy adult participant database and through word of mouth via other participants.

Participants were provided with a participant information sheet and gave their written informed consent prior to being studied. The guidelines of the Declaration of Helsinki were followed and the rights, dignity, safety and well-being of participants were respected throughout the study. Ethical approval was obtained from the Faculty of Health Sciences Ethics Committee at the University of Southampton (Ethics No. 18039).

Equipment

Three items of experimental equipment were used:

Mechanomyography (MMG) – muscle vibrations were measured using MMG sensors, each consisting of a microphone (Knowles SPU1410) and a conical chamber with a height of 5mm and a diameter of 7mm enclosed by a Mylar membrane (Figure 1). The MMG sensors employ a miniature silicon microphone (Knowles SPU1410LR5H-QB) consisting of an acoustic sensor, a low noise input buffer, and an output amplifier.

[insert Figure 1.]

Figure 1. MMG hardware used in this study. The device is comprised of a clip/cap (blue) to compress all the parts together, a sleeve to keep the membrane (gray) taut, an acoustic chamber/housing and an electronic board which holds the microphone.

Electromyography (EMG) – surface EMG (sEMG Biometrics SX230100) was used to compare with MMG, to examine known relationships with force and to compare the reliability of the two signals.
Wrist rig – The wrist rig is an instrumented neuromechanical measurement device consisting of an armrest attached to a chair with a potentiometer (angle sensor) and strain gauge (force sensor) and with two channels of sEMG. Wrist position is indicated by an LED pointer which allows the user to track a moving target (indicated by a blue LED) around a 120-degree horizontal arc. The wrist rig was developed to measure wrist motor impairments in stroke, including isometric flexor and extensor strength, motor control accuracy, wrist stiffness and muscle activation patterns during dynamic tracking tasks and response to rapid stretching (stretch reflex response) for spasticity. These indices were evaluated for test-retest and inter-rater reliability and the sensitivity to distinguish between healthy individuals and stroke patients\textsuperscript{17}.

[Insert Figure 2.]

Figure 2. Participant set up in the wrist rig showing force sensors, angle sensors, sEMG attached to the forearm flexors and location of MMG sensors on the forearm flexors.

Technical developments to the wrist rig

Hardware - two MMG sensors were integrated with the wrist-rig in order to compare EMG and MMG signals on wrist flexors and extensors. One analogue channel was used for each MMG. The control unit of the wrist-rig provided power supply to the MMG sensors at 3.3V and measured their output voltage. The system underwent safety testing prior to the experiments.

Software - The software developed for the wrist-rig was modified to acquire and process the signal from the MMG sensors. The graphical user interface was upgraded in order to display the MMG signal. In particular, the MMG signal was band-pass filtered and rectified for the purpose of visualisation\textsuperscript{18}.

Testing of the MMG component

All test procedures were carried out independently at the University of Southampton by one trained Research Physiotherapist (CM).

The validity of the MMG sensors was examined against known measures of isometric force (generated at the wrist) and EMG recordings of electrical muscle activity, following an established testing protocol for isometric muscle activity to confirm known force/MMG/EMG relationships\textsuperscript{15}.

The neuromechanical rig (Wrist Rig) was used for isometric and dynamic testing\textsuperscript{17}. The participant was seated comfortably in the wheelchair, to which the wrist rig was attached. Following skin preparation using EMG SENIAM recommendations\textsuperscript{20}, surface EMG
electrodes were placed over the flexor carpi radialis (FCR) on a line from the medial epicondyle of the elbow to the radial styloid process, one third distal to the medial epicondyle. The extensor (extensor carpi radialis longus) EMG electrodes were placed on a line from the lateral epicondyle of the elbow to the 2nd metacarpal, 5-7cm distal to the lateral epicondyle. The MMG sensor was placed on the muscle belly close (distal) to the EMG electrodes. The muscle body was determined by clinical assessment by a chartered physiotherapist (CM).

The participant performed a pseudo random step-tracking task, which generated the data to examine the reliability of onset times. The task involved following a red light on the wrist rig, flexing and extending the wrist. The participant then performed an isometric task by flexing the wrist with maximal effort, pushing against a resistance for three seconds, during which force, and surface EMG and MMG were recorded over the flexor carpi radialis muscle. Three maximal contractions were performed and the highest value taken as maximal. Percentages of maximal effort were calculated from the force signal and used as a target for submaximal contractions at 10, 25, 50, and 75% of maximal. Three contractions were performed at each level of effort (3 contractions at 5 levels of effort, totalling 15 contractions). Rest periods (30-60 seconds, as required) were given between each set of contractions and 10-15 secs between each contraction. Each testing session lasted no longer than 90 minutes and decreased during the study, ranging from 45-90 minutes. Participants attended on two days, one week apart, on the same day of the week and at the same time of day, as far as possible.

[Insert Figure 3.]

Figure 3. Schematic Diagram of wrist rig equipment. EMG: electromyography; LED: light emitting diode; MMG: mechanomyography; USB: universal serial bus.

Signal Processing

The EMG and MMG signals were pre-processed in the same way for consistency. Firstly, the signals were decimated, secondly a 50Hz notch filter was applied to the EMG, thirdly a 10Hz-50Hz band pass filter was applied to the MMG, fourthly an 80Hz low-pass filter was applied to the Torque, and finally the MMG signal was then rectified. The 50Hz notch filter aims to remove AC interference from the power line for all measurements. The 10Hz-50Hz band pass filter applied to MMG measurements aims to remove the low-frequency bias and the high-frequency noise. These values have been chosen as in [13], since they represent the lower bound and the upper bound of the mean power frequency of MMG signals. The 80Hz low-pass filter applied to the torque measurements aims to remove high frequency noise. This value was chosen empirically and represents a good compromise between noise reduction and attenuation of high frequency signal components.
The onset time for MMG and EMG signals was calculated in the tracking task. Wrist extensor muscle onset timing was defined as the interval between the target light switching on (from a flexion position to an extension position) and the detected MMG/EMG onset, where the onset threshold was four standard deviations above a resting local baseline of extensor MMG/EMG. This was recorded for 1 second immediately prior to each extension target switching on during a step tracking task. An algorithm (written in Matlab) was used for automated calculation of onset time and checking of all onset points was conducted by visual inspection.

The root-mean-square (RMS) values were calculated over 1 second for MMG and EMG signals during the isometric phases of the tasks.

Data protection and anonymity

All data were anonymised and each participant was assigned an ID number, so that they could not be identified. Data were stored on a password-protected computer and only the research team had access to data. Data will be kept for 10 years after the study, following the Policy of the University of Southampton.

Data Analysis

Data management - Data were entered into Excel files and summarised for the sample as means and standard deviations.

Statistical analysis - The data for the MMG and EMG signals were tested for normality of distribution using the Shapiro-Wilk test. The relationship between EMG and MMG signals was examined using correlation analysis ($R^2$). Reliability was examined using the Intraclass Correlation Coefficient (ICC) and Bland and Altman analysis. The ICC model used was a single measures one-way random effects where people effects are random.

Results

Reliability of MMG and EMG signal onset time between days

The delay in onset of MMG and EMG from the start of the tracking task (appearance of the target light) was reliable between the two days and similar between the two signals. The ICC for MMG was 0.78 and for EMG was 0.79. The 95% confidence intervals were: MMG 0.519-0.913 and EMG 0.541-0.918.

Bland & Altman analysis plots did not reveal any systematic bias, as illustrated for MMG (Figure 2) and EMG (Figure 3). The mean difference for MMG was 0.0011 (limits of agreement 0.115 to -0.092) and EMG mean 0.0315 (0.141 to -0.079).

[insert Figure 4.]
Figure 2. MMG Bland and Altman plot for difference between onset times (s, seconds) recorded on Day 1 and Day 2

[insert Figure 5.]

Figure 3. EMG Bland and Altman plot for difference between onset times (s, seconds) recorded on Day 1 and Day 2

Validity of MMG against force of contraction

The relationship between force of contraction and the MMG signal was highly correlated ($R^2 0.94$), as illustrated in Figure 4.

[insert Figure 6.]

Figure 4. Relationship between force (% of maximal) and mechanomyography (root mean square; RMS). Mean and standard error of the mean for values between 10% and 100% force.

Discussion

This study examines the reliability and validity of recordings of mechanical muscle activity during upper limb tasks using a newly designed and patent-filed MMG. The present findings demonstrate that MMG recordings made during voluntary contractions on different days are reliable and are also related to changes in force, indicating their validity for assessing mechanical muscle activity.

Evidence has previously reported MMG to have high reliability to measure muscle force contraction$^{21-22}$. Previous literature has indicated that using MMG RMS has high between-day reliability (ICC 0.8) when compared with EMG to determine force (the more conventional means of recording surface muscle activity)$^{23}$. However, additional evidence has been required to determine the between-day reliability of MMG with respect to measuring muscle onset timing. High between-day reliability of EMG to measure muscle onset timing has previously been demonstrated by Hodges et al., who reported that EMG had a high level of between-day reliability when utilizing a visual inspection method to determine muscle onset timing$^{24}$. The present study demonstrated MMG signals were as reliable between days as EMG (MMG ICC = 0.78 and EMG ICC = 0.79) demonstrating our newly designed MMG is comparable with EMG to measure muscle onset timing.

Various factors affect reliability of recording of MMG signals, including contact pressure$^{25-27}$, muscle length/joint angle, temperature; and positioning of the sensor. This is because greater MMG activity is recorded over the middle of the muscle belly; although frequency is unaffected$^7$. These factors therefore need to be considered when using MMG
sensors and standardised as much as possible; the level of precision necessary varying with the intended use. For example, laboratory investigations of muscle characteristics would require more precise recording conditions compared to biofeedback in field situations.

Placement of the MMG device over the muscle affects the nature of the signals recorded\textsuperscript{28-29}. It is therefore important to place the device consistently at the same site to ensure reliability of repeated recordings.

The strong relationship found between force of contraction and the MMG signal (R\textsuperscript{2} 0.94) confirmed previous literature that MMG provides a valid indication of changes in force levels\textsuperscript{16, 30}. The present study involved brief isometric contractions in previously rested muscle, which showed characteristic linear relationships between force and EMG, and force and MMG\textsuperscript{31, 15}. However, when muscle is fatigued evidence suggests an alteration in the MMG and EMG signal parameters and \% of MVC relationships\textsuperscript{32}. MMG provides a more accurate assessment of changes in force than EMG, due to dissociation that occurs between force and EMG when fatigue is present during isometric and dynamic contractions\textsuperscript{33-34}. This occurs due to higher neural effort being required to achieve a given force.

A limitation of the present study was that the motor tasks used for recording signals were not functional. The purpose was to standardise the recording conditions as far as possible. The wrist rig used for measuring muscle onset time of dynamic contractions restricted the plane of movement. The contractions used to generate different levels of force of contraction were isometric and also restricted in their direction. Reliability during more functional tasks needs to be examined, now that the performance of the sensor has been established for recording signals from muscle.

Conclusions

Our MMG sensor produced reliable signals in terms of timing of muscle activity onset, comparable with the reliability of EMG signals, when a step-tracking task was repeated on different days. The MMG sensor signals were valid when compared with isometric force, confirming the MMG/force relationship documented in the literature. In the context of using the MMG sensors within the M-Mark project, the present study has demonstrated that our MMG sensor offers a valid and reliable measurement for measuring mechanical muscle activity for incorporation into a wearable device for stroke rehabilitation.
Declarations

Conflicting Interest Declaration

The Author(s) declare that there are no conflict of interest(s).

Funding Declaration

The work published was funded by the UK National Institute for Health Research Invention for Innovation Programme (i4i). The views expressed are those of the authors and not necessarily those of the NHS, the NIHR or the Department of Health & Social Care.

Guarantor Declaration

MS

Contributorship Declaration

CM - was involved with testing technical developments to the wrist rig, recruiting participants, lab techniques, data collection, analysis of signals, statistical analysis of data, drafting and revising the manuscript, training and supervision of LM.

EF – was involved with hardware (design, manufacturing, and testing of the MMG) and software provision (support for the data-analysis algorithms) technical developments to the wrist rig, data collection, developed algorithms for analysis of signals, support for analysis of signals and drafting the manuscript.

MS - was involved with concept of the work, acquisition of funding, protocol development, gaining ethical approval, drafting and revising the manuscript, supervision of CM for the following: lab techniques, data collection, analysis of signals and statistical analysis of data.

RT - was involved with concept of the work, acquisition of funding, training of CM in lab techniques and analysis of signals, revising the manuscript.

RV - was involved with concept of the work, acquisition of funding, hardware provision, holds patent on MMG, expertise in signal processing; supervision of EF, revising the manuscript.

JB – was involved with concept of the work, acquisition of funding, revising the manuscript. Overall PI of main project.

LM – was involved with analysis of signals, statistical analysis of data and revising the manuscript.
SW– was involved with hardware provision (design, manufacturing, and testing of the MMG) and revising the manuscript.

NS– was involved with software development (support for the data-analysis algorithms, hardware-software sensing/signal capture interface) and revising the manuscript.

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References


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\[ y = 0.0003x + 0.0042 \]
\[ R^2 = 0.9425 \]