

Mechanomyogram for Muscle Function Assessment: A Review

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Abstract

Background: Mechanomyography (MMG) has been extensively applied in clinical and experimental practice to examine muscle characteristics including muscle function (MF), prosthesis and/or switch control, signal processing, physiological exercise, and medical rehabilitation. Despite several existing MMG studies of MF, there has not yet been a review of these. This study aimed to determine the current status on the use of MMG in measuring the conditions of MFs.

Methodology/Principal Findings: Five electronic databases were extensively searched for potentially eligible studies published between 2003 and 2012. Two authors independently assessed selected articles using an MS-Word based form created for this review. Several domains (name of muscle, study type, sensor type, subject's types, muscle contraction, measured parameters, frequency range, hardware and software, signal processing and statistical analysis, results, applications, authors' conclusions and recommendations for future work) were extracted for further analysis. From a total of 2184 citations 119 were selected for full-text evaluation and 36 studies of MFs were identified. The systematic results find sufficient evidence that MMG may be used for assessing muscle fatigue, strength, and balance. This review also provides reason to believe that MMG may be used to examine muscle actions during movements and for monitoring muscle activities under various types of exercise paradigms.

Conclusions/Significance: Overall judging from the increasing number of articles in recent years, this review reports sufficient evidence that MMG is increasingly being used in different aspects of MF. Thus, MMG may be applied as a useful tool to examine diverse conditions of muscle activity. However, the existing studies which examined MMG for MFs were confined to a small sample size of healthy population. Therefore, future work is needed to investigate MMG, in examining MFs between a sufficient number of healthy subjects and neuromuscular patients.

Citation: Islam MA, Sundaraj K, Ahmad RB, Ahamed NU (2013) Mechanomyogram for Muscle Function Assessment: A Review. PLoS ONE 8(3): e58902. doi:10.1371/journal.pone.0058902

Editor: William Phillips, University of Sydney, Australia

Received August 17, 2012; Accepted February 8, 2013; Published March 11, 2013

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Funding: There is no specific sponsors or funds for this study.

Competing Interests: The authors have declared that no competing interests exist.

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Introduction

Researchers are exploring to set suitable methods to examine muscles' activities noninvasively; these methods for example, include surface electromyogram (sEMG) [1,2], sonomyogram (SMG) [3,4], tensiomyogram (TMG) [5,6], and mechanomyogram (MMG) [7,8].

Although the widely used sEMG has attracted attention for decades as a reliable tool for the assessment of skeletal muscles, it has some drawbacks. sEMG is sensitive to external noise and interference, which limits its operating environment and range of application [9]. In addition, sEMG sensor requires low noise and a very stable signal component [9]. Furthermore, signal processing and analysis is complex [9,10]. It is also expensive, since it requires three electrodes for differential recordings [9].

Conversely, MMG has been proposed as another tool to study muscle mechanical activity [11]. The term mechanomyography represents a technique by which the mechanical activity of muscle is detected using specific transducers to record muscle surface oscillations due to mechanical activity of the motor units [12]. MMG signals can be detected using several types of transducers including piezoelectric contact sensors (PIZ) [13–15], microphones

(MIC) [7,16,17], accelerometers (ACC) [18–22] and laser distance sensors (LDS) [23–25].

MMG can provide some notable advantages over sEMG [26]. First, due to its propagating property through the muscle tissue, the placement of MMG sensors is not required to be precise or specific [27]. Second, MMG is a mechanical signal; thus, it is not influenced by the change in the skin impedance due to sweating [9,26]. Further, MMG can be used in conjunction with sEMG to examine neuromuscular function [28].

However, with the aid of MMG, many researchers have continued to explore its application aspects. There are many examples where MMG has been applied to characterize muscle activity. These applications include for example, the characterization of MFs [22,29–31], the development of prosthesis and/or switch control [32,33], studying activity of motor unit [34–36], evaluating muscles during sports and exercises [37–39], monitoring neuromuscular blockade [40], and development of a suitable model for studying the motor unit activity [41]. In addition, we have found several studies which conducted research on MMG sensor development [6,15,42], simultaneously testing multiple sensors and comparing their effects on muscles' [43,44]. We also

have found several studies that evaluated the sensor placement effect on muscles [19,45]. Several works on MMG signal processing for muscle characterization [16,46,47] have already been reported.

However, we only found three MMG related review articles [28,48,49], which examined MMG amplitude and frequency responses [49], as well as motor unit recruitment strategies [28] and motor unit firing rates [48] during dynamic muscle actions. To our knowledge, there has not been an article which presents a review of MMG for monitoring MFs. This gap motivates the present study. Therefore, the purpose of this review was to determine the current status on the use of MMG in assessing MF. Another objective was to use this review outcome to identify priority area(s) for future research.

Methods

Searching

We performed a comprehensive literature search for MMG of MF assessment in the Elsevier, PubMed, IEEE, SpringerLink, and Google Scholar electronic databases for relevant articles published from 2003 to 2012. We deliberately set our search strategy (the details of the search strategy may be obtained from Table S1) to be broad in the combined search of: # 1 (mechanomyography) AND # 2 (systematic review AND review) AND # 3 (muscle-function) AND # 4 (muscle-assessment) NOT # 5 (electromyography). There were no language and category restrictions during databases searching. Journal articles, conferences, books, letters, and clinical reports were examined for potentially eligible studies. In addition, we checked the reference lists of all important articles that were retrieved in the search.

Study selection

The title and abstract of studies identified by the search were screened for potential relevance. The full text of all potentially relevant studies was reviewed to determine if they fulfilled the eligible criteria. We included studies that described a theoretical or practical of only MMG for MF assessment. Two authors (MAI and NUA) independently screened the results of the electronic searches to select potentially relevant citations based on the title and abstract according to the criteria defined above. The studies those meet the most relevant criteria best were included for this review. The studies those were written in a language other than English, and articles those examined animal muscles were eliminated. In addition, we excluded articles that lacked in-depth discussions, without proper data presentation, and with unclear or vague descriptions of the protocol used.

Data extraction

Two authors (MAI and KS) abstracted data individually using an MS-Word structured data extraction form specially created for this review (Table S2). The extracted data were compared and discussed by the two authors before being compiled as final information. Information extracted from each article included: i) name of the studied muscle and its contraction type, ii) sensor type and model, iii) MFs and subject types, iv) measured parameters, algorithms and hardware, v) main results, vi) author comments, vi) recommended applications and vii) priority for future research.

Validity assessment

Three authors (MAI, KS and BA) analyzed the data extracted from the potentially relevant articles. After analysis we decided to depend on information extracted from the most relevant studies; those that were organized with proper data presentation, clearly verified selection of protocols, and through demonstration of research methodologies, to reduce risk of bias.

Quantitative data synthesis

There was a significant number of MMG driven MF assessment studies across areas of muscle fatigue, strength, muscle balance, muscle movement activities, and effects on muscle conditions for practicing exercises. We described these studies qualitatively and present detailed results in tabulated form (Table 1–Table 7).

Results

Flow of included study

The comprehensive literature search returned a total of 36 articles (Figure 1). Of these, 16 met the inclusion criteria as muscle fatigue, three met as strength, one met the inclusion criteria as muscle balance, whereas seven met as muscle movement activities, and the remaining nine met the inclusion criteria as muscle exercise or stretching.

Study characteristics

Among the 36 relevant studies, 30 studies were peer-reviewed journal articles, six studies were conference papers. Nine [13,15,21,42,50–54] involved fatigue assessment from upper arm (biceps brachii, BB) muscles, five studies [14,29,30,55,56] were related to fatigue assessment of leg muscles (quadriceps), one [57] conducted fatigue investigation of the masseter muscle and another [58] presented fatigue measurements of both BB and vastus lateralis (VL) muscles. Three studies [59–61] incorporated strength tests from VL, rectus femoris (RF), and BB muscles. Another study [31] included muscle balance investigation of quadriceps muscles. Seven studies [7,22,33,62–65] involved muscle activities of movements from different muscles, and the rest nine [8,37–39,44,66–69] were related to investigation of MFs of diverse exercises from quadriceps muscles.

Fatique assessment

Table 1 presents the main details of fatigue measurement of nine relevant studies using MMG from BB muscle. Gregori et al. [42] developed a new surface composite probe for differential MMG and sEMG recording in order to measure muscle fatigue from BB. A similar non-differential MMG sensor was used for comparisons. The new sensor recorded muscular activity more efficiently than the non-differential probe and could therefore be useful in studying fatigue and neuromuscular diseases [42]. Tanaka et al. [15] developed a PIZ to monitor muscle fatigue for the biceps and triceps brachii muscles. The authors reported that they were able to measure muscle fatigue using the developed sensor [15].

Beck et al. [13] performed a comparison between the fast Fourier transform and the discrete wavelet transform for determining MMG and sEMG centre frequency patterns during fatiguing isokinetic muscle actions of the BB muscle. The authors suggested that Fourier-based methods were acceptable for determining the patterns for normalized MMG and sEMG centre frequency during fatiguing dynamic muscle actions at moderate velocities [13].

Madeleine et al. [54] analyzed the trends of the first three power spectral moments of the MMG signals recorded from the BB muscle using a MIC and an ACC during sustained fatiguing contractions at 30% of maximum voluntary contractions (MVC). For both the MIC and ACC, absolute and normalized root mean square (RMS) values and power spectral variance increased while mean frequency (MNF) and skewness decreased with contraction

 Table 1. An overview of MMG driven fatigue test from the biceps brachii muscle.

peak of MPF with time reached quickly for fairs subject. Comment: 0 Insufficient sample size and lack of details; ii) The development MMG sensor enables monitoring of muscle condition like fatigue via evaluation parar as MPF and variance. Future work: Not suggested. Xie et al. (2010) ACC S healthy human subjects are healthy or not; ii) MMG and signal sample size and unclear whether subjects are healthy or not; ii) MMG and signal subject subjects	Study	Sensors	Subjects	Parameters	Assessment	Results
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Sie et al. (2010) ACC Sheabthy human convolution dimension (D.) Comment: Diristificient sample size and lack of details; ii) MMG is a high-dimensional chaotic signal which supports the use of nonlinear dynamics theory for an and modelling of fatigue. Future work: Combining the surrogate data method with chaotic invariants may be potentially applied to differentiate the muscle states. Hendrik et al. (2010)ACC 10 activit (4 males and 6 females a			and lack of details; ii) T	he development MMG senso	r enables monitoring of	muscle condition like fatigue via evaluation parameter
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and of females, mean age:	Future work: Comb	oining the surroga	te data method with	chaotic invariants may be p	otentially applied to diff	erentiate the muscle states.
Future work: Future studies should examine sEMG and MMG MPF responses during continuous muscle actions at sEMG MPF _{FF} and MMG MPF _{FF} to directly validate tests. It et al. (2009) ACC 5 subjects m and D2 Fatigue signal nature work is a subject signal which supports the use of nonlinear dynamics systems. Comment: i) Insufficient sample size and lack of details; ii) MMG is a high-dimensional chaotic signal which supports the use of nonlinear dynamics theory for analysis and modelling MMG signals. Future work: Not suggested. Feng et al. (2009) MIC 5 healthy subjects, (age; from 21 to 32 years; 4 males and 1 female) ShawCR, RMS and Fatigue and muscle activity. For MMG activity and activity contraction. There was significant change in the force of contraction there was significant change in the force of activity and consistent decrease in the value of MMG with the increase of matigue but the MMF of the MMG is observed to be very inconsistent and hence not a useful tool to measure muscle fatigue. Comment: i) Insufficient sample size of healthy subjects and imbalance with sex; ii) There is a consistent decrease in the RMS value of MMG with the increase of matigue but the MMF of the MMG is observed to be very inconsistent and hence not a useful tool to measure muscle fatigue. Comment: i) Insufficient sample size and only healthy subjects; iii Maximal displacement, and the impact of gel applied to the surface of the MIC prior to determ the efficacy of MMG to identify muscle activity. Krizaj et al. (2008) LDS 13 healthy males (age; from 19 to 42 years) Madeleine et al. ACC and MIC 14 healthy males (age; from 19 to 42 years) Madeleine et al. ACC and MIC 15 healthy males (age; from 19 to 42 years) Madeleine et al. ACC and MIC 16 healthy males (age; from 19 to 42 years) Madeleine et al. ACC and MIC 16 healthy males (age; from 19 to 42 years) Madeleine et al. ACC and MIC 17 healthy males (age; from 19 to 42 years) Madeleine et al. ACC and MIC 18 healthy males (age; from 19 to 42 years) Madeleine et al. ACC an	Hendrix et al. (2010))ACC	and 6 females, mean age:	sEMG, and critical	Fatigue threshold	fatigue thresholds (CT, sEMG MPF $_{\rm FT}$ and MMG MPF $_{\rm FT}$ and the mean torque values (Nm) from the three fatigue thresholds were significantly inter-correlated
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Madeleine et al. ACC and MIC (2006) ACC and MIC (2007) ACC and				Maximal displacement and l	nalf relaxation time show	largest influence on muscle fatigue rate and hence a
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Gregori et al. sEMG and PIZ Normal subjects MMG and sEMG Sensor development Differential amplification significantly improved (2003) coupled amplitude for fatigue signal-to-noise ratio in MMG recordings and significantly suppressed artifacts. Comment: i) Unclear sample size and lack of details; ii) The new composite probe records muscular activity more efficiently than non-differential probes.					ii) Fourier based metho	ds are acceptable for determining the patterns for
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Future work: Not suggested.	Comment: i) Uncle	ar sample size and	d lack of details; ii) Th	e new composite probe rec	ords muscular activity m	ore efficiently than non-differential probes.
	Future work: Not s	uggested.				

doi:10.1371/journal.pone.0058902.t001

Table 2. An overview of fatiguing MMG assessment for quadriceps muscles.

Study	Sensors	Subjects	Parameters	Assessment	Results
Armstrong (2011)	ACC	10 healthy subjects (gender balanced, age: 25±3 years)	Intensity, wavelet index and frequency	Fatigue and postural control	Peak MMG intensity was at lower frequency 12 Hz for male, and valley intensity was at higher frequency 42 Hz for female. Intensity increased with fatigue.
					and studying fatigue from the VL, VM and RF muscles es in MMG (and sEMG) intensity need to be warranted
Hendrix et al. (2010)	ACC	9 adults (4 males and 5 females; age: 21.6±1.2 years)	MMG MPF _{FT} and torque	Fatigue threshold	There were no differences in the isometric torque levels associated with the MMG MPF _{FT} for the three superficial (VL, VM, and RF) muscles of the quadriceps.
during isometric mu	uscle actions. Fu				e method to examine fatigue of quadriceps muscles intermittent isometric and dynamic muscle actions or
Al-Zahrani et al. (2009)	ACC	31 healthy subjects (15 males; age: 32.3±7.6 years, 16 females; age: 30.3±10.3 years)	RMS, MPF, MDF and ICC	Reliability of fatigue test within day and between days	Low reliability and large error for between days o MPF and MDF respectively. Overall, ICC was highly reliable for MPF with lower SDD for MDF.
		ils is reliable but only healthy n days on healthy subjects o		MPF and MDF linear reg	ression slopes from the RF muscle are not suitable fo
Future work: Not su	uggested.				
Faller et al. (2009)	ACC	10 healthy males (age: 26.7±5.35 years)	RMS, MPF of MMG and torque	Fatigue at the presence of NMES	At present NMES, MMG RMS correlated with torque but MMG MPF did not significantly correlate with torque.
					application of NMES protocol can be simultaneously 5-generated muscle contractions. Future work: Not
Ebersole et al. (2008)	PIZ	10 healthy males (age: 23.2±1.2 years)	Torque and EME	Fatigue	Linear regression confirmed the decrease in torquand EME for VM and VL. EME slopes were same for VM and VL.

doi:10.1371/journal.pone.0058902.t002

time [54]. Feng et al. [51] reported an experimental study of MIC-based MMG signal intensity against force of contraction and muscle fatigue during cyclic contractions of the BB muscle. They observed that MMG signal intensity decreased with the increase of onset of muscle fatigue [51]. Furthermore, Krizaj et al. [53]

claimed maximum displacement and half relaxation time as parameters to measure muscle fatigue for the BB muscle.

Xie et al. [21] explored fatigue MMG signals during static contractions by applying nonlinear dynamic analysis methods for the BB muscle. The results advocated the use of nonlinear

Table 3. An overview of MMG-driven fatigue test.

Study	Sensors	Muscles	Subjects	Parameters	Assessment	Results
loi et al. (2006)	Amorphous with small magnet	Masseter	16 healthy Japanese males (age: 25.6±2.3 years)	Bite-force, EME and average rectified value (ARV)	Fatigue during bite force	ARV for MMG raised up to 20% and then started to fall. A nonlinear and linear relationship between MVC and ARV of pre and post fatigue for MMG and sEMG respectively was observed. EME was lower at post fatigue.
Comment: i) Sm	all sample size and	only healthy sul	bjects; ii) MMG analys	is combined with sEN	MG may be a more us	seful method for evaluating the masseter muscle
fatigue.						
fatigue. Future work: The	e relationship betwe	en force and th	ne MMG activity is to	be warranted.		

Future work: Not suggested.

doi:10.1371/journal.pone.0058902.t003

Table 4. An overview of muscle strength assessment.

Study	Sensors	Muscles	Subjects	Parameters	Assessment	Results
Ryan et al. (2007)	ACC	VL	12 healthy males (age: 25±4 years)	MPF, RMS of MMG and torque	Muscle strength	MMG amplitude versus isometric torque relationship was best fit with a linear model for the lower strength group and a cubic model for the higher strength group. MMG MPF was best fit with a linear model for both the groups.
Comment: i) Sm	all sample siz	e and only health	y subjects; ii) Differences in	strength do not affect	t the patterns of resp	onses for MMG amplitude or MPF.
Future work: Fu	ture studies s	hould examine the	e individual patterns of resp	onse to draw conclus	ions about motor cor	ntrol strategies.
Marek et al. (2005)	ACC	VL and RF	10 females (age: 23±3 years) and 9 males (age: 21±3 years); apparently healthy subjects	MMG amplitude, pT and mean power (MP)	Strength at slow and fast speeds	MMG amplitude increased for the RF muscle at 60°/s static stretching but remained unchanged in all other cases.
strength, power	output, and	muscle activation	at both slow (60°/s) and fast	(300°/s) velocities.Fu	ture work: Further res	acilitated stretching caused similar deficits in earch is needed to examine the effects of preed a muscle, tendon, or joint injury.
Matta et al. (2005)	ACC	ВВ	15 males (age: 24.0±5.25 years) and 12 females (age: 21.7±1.5 years); healthy subjects	RMS and MNF of MMG signal	Strength of male and female	RMS in X-axis and Y-axis increased with workload for both male and female, but MNF for male was almost stable and slightly decreased for female with workload in both

Comment: i) Relatively small sample size and only healthy subjects; ii) RMS in X-axis and Y-axis of the ACC sensor increased with workload for both male and female, but MNF for male was almost stable and slightly decreased for female with workload for both the axes.

Future work: Not suggested.

doi:10.1371/journal.pone.0058902.t004

dynamics theory (Volterra–Wiener–Korenberg model and noise titration approach) for analysis and modelling of fatiguing MMG [21]. Again, Xie et al. [52] investigated linear and non-linear properties of MMG signal detected from the BB muscle during fatiguing isometric contractions. They reported that MMG signal during fatigue was nonlinear from all subjects [52].

Hendrix et al. [50] examined fatigue threshold from the BB muscle by comparing the critical torque threshold, electromyographic mean power frequency fatigue threshold (sEMG MPF $_{\rm FT}$), and mechanomyographic mean power frequency fatigue threshold (MMG MPF $_{\rm FT}$). They suggested that there were no significant differences between these fatigue thresholds, and the mean torque values from the three fatigue thresholds were significantly intercorrelated at r=0.94–0.96. Thus, activated motor units may be examined by using non-invasive methods like the MMG MPF $_{\rm FT}$ test [50].

However, five relevant studies focused on fatigue assessment from the quadriceps muscles (Table 2). Ebersole and Malek [14] examined the relationship between fatigue and electromechanical efficiency (EME) for the VL and vastus medialis (VM) muscles and found 58% and 66% decreases in EME for the VM and VL respectively, concurrently with a 47% decline in torque production. They concluded that in healthy muscles, the EME of both muscles decreased concurrently with a decrease in torque [14].

Faller et al. [55] studied using triaxial-based ACC for MMG signal from the RF muscle to assess fatigue during the execution of neuromuscular electrical stimulation (NMES) protocol, which is used widely for rehabilitation in the physical therapy of fatigue caused by excessive voluntary contraction. They confirmed that the RMS value of MMG correlated with torque but mean power frequency (MPF) of MMG did not significantly correlate for the present NMES protocol [55].

Al-Zahrani et al. [56] investigated the reliability in assessing RF muscle fatigue within-day and between-days using triaxial ACC-assisted MMG. They found poor reliability [56] in between-days for fatigue assessment. The poor between-days reliability found in this study suggests caution in using MMG RMS, MPF, median frequency (MDF) and their corresponding regression slopes in assessing muscle fatigue due to the high number of smallest detectable difference (SDD) values [56].

Table 5. Overview of MMG for assessing muscle balance.

Study	Sensors	Muscles	Subjects	Parameters	Assessment	Results
Armstrong et al. (2010)	ACC	VL, VM and soleus	5 males and 5 females (mean age: 25±3 years); healthy subjects	MMGp-p and ICC	Balance and postural control	Almost all measurements demonstrated moderate-to-strong reliability in examining balance.

Comment: i) Small sample size and only healthy subjects; ii) MMG provides reliable information pertaining to balance, and may have application in evaluating postural control and stability.

Future work: Need to determine relationships and predictability of these measures in a controlled quasi-static positioning with more dynamic motions and fatigue states.

doi:10.1371/journal.pone.0058902.t005

Table 6. Overview of MMG for muscle movement activities assessment.

Study	Sensors	Muscles	Subjects	Parameters	Assessment	Results
Kawakami et al. (2012)	MIC	Lateral pterygoid	3 healthy males(age: 29.3±2.5 years)	sEMG amplitude and MMG amplitude	Movement activity during clenching	MMG and sEMG amplitudes correlated for both 20 mm and 30 mm jaw movements but not fo 10 mm and maximal clenching lateral pterygoid muscle movements.
				ivity of the lateral ptery ure work: Not suggeste		ot be evaluated using MMG, especially during the
Krueger et al. (2011)	ACC	RF and VL	12 healthy subjects (age: 31.45±4.56 years) and 13 SCI patients (age: 32.06±9.46 years)	RMS, MNF and skewness of MMG, and knee angle	Knee angular movement	The correlation between MMG MNF and MMG RMS in healthy subjects was classified as positive, and it was classified as weak in SCI patients.
		•	thy subjects are comp movements.Future w		ss and MMG MNF ar	e spectral analysis features, and they showed
Alves and Cahu, (2010)	MIC and ACC coupled	Frontalis	10 healthy subjects (5 males; age: 27±2 years)	Time vs. RMS value of MMG, and frequency vs. CWT for 4 eyebrow movements	Movement activities to control binary switch	The average sensitivity and specificity of the MMG-driven switch was 99.7 \pm 0.4% and 99.9 \pm 0.1%, respectively.
				muscle is a suitable si MMG-driven control fo		e MMG-driven switch during eyebrow tion is warranted.
Scheeren et al. (2010)	ACC	RF and VL	10 healthy males (age: 28.3±6.6 years) and 3 SCI male patients (age: 34.4±9.8 years)	RMS and MNF of MMG	Muscle functional movement	The lowest values for MMG RMS and MNF parameters were verified in the 200–50 FES profile suggesting less muscle modification during the experiment.
				r patients and healthy s nal movements.Future		y may be helpful in creating experimental setup d.
Tian et al. (2010)	ACC	VL	10 healthy elderly (age: 64.0±4.5 years) and 10 healthy young adults (age: 22.0±2.8 years)	RMS and MNF of both MMG and sEMG, and movement intensity	Age-related sarcopenia	The MMG RMS showed differences between the young and the elderly across all three intensity levels whereas sEMG RMS differed only at the greatest intensity.
						sEMG MNF and MMG MNF, show different result mine age-related sarcopenia.Future work: Not
Scheeren et al. (2010)	ACC	Forearm muscles	20 healthy males (age: 24.0±5.5 years)	MMG RMS, peak counting and zero crossing	Wrist movement	MMG signals of flexion differed from extension ulnar and radial deviations, and radial deviation differed from ulnar deviation and flexion.
the developme	nt of new control	strategy algorithm	s for driving upper-lir		vork: Need to study	or more MMG sensors brings good perspective to larger number of limb movements for control vidually.
Yoshimi et al. (2009)	ACC	Masseter	19 healthy subjects (16 males and 3 females, age: 28.5±5.8 years)	Amplitude of MMG and sEMG, muscle activity vs. bruxism length	Movement due to sleep bruxism	Tapping was a rhythmic muscle activity with Y axis movement, clenching was a strong muscle activity with no Y-axis movement, and grinding was a muscle activity with X-axis and Y-axis movements.
Comment: i) Sr	•	nd imbalance in ger	nder types; ii) Tapping	g, clenching, and grindi	ng movements of th	ne mandible could be effectively differentiated b

doi:10.1371/journal.pone.0058902.t006

Future work: Not suggested.

Hendrix et al. [30] tested MMG MPF $_{\rm FT}$ from the VL, VM and RF muscles during each fatiguing isometric muscle action. They determined that there were no significant differences among the MMG MPF $_{\rm FT}$ values for the three muscles. Hence, the MMG MPF $_{\rm FT}$ test may provide a non-invasive method to examine the fatiguing effects during isometric muscle actions [30].

Armstrong [29] studied the intensity analysis of Morlet wavelets of MMG signal as an alternative to power spectral analysis for the evaluation of postural control strategy during the single-legged stance and to examine the effects of fatigue over the VL, soleus and VM muscles. He found that the intensity of MMG signals

increased with increasing fatigue [29]. Furthermore, he mentioned that intensity analysis is a useful tool for exploring posture control and fatigue study [29].

One study by Gobbo et al. [58] verified twitching torque and MMG peak-to-peak (MMGp-p) amplitude from both dominant BB and VL muscles by inducing fatiguing stimulation to investigate muscle fatigue. Another relevant study by Ioi et al. [57] showed supporting evidence of using EME as a parameter to measure masseter muscle fatigue. Table 3 presents an overview of the two relevant studies of fatigue assessment.

Table 7. Overview of MMG measurement in exercises.

Study	Sensors	Muscles	Subjects	Parameters	Assessment	Results
Esposito et al. (2011)	ACC	MG	11 healthy males (age: 22±1 years)	RMS and MNF of MMG and sEMG	Stretching effects on MMG	After stretching, no significant change was found by sEMG, MMGp-p and slope decreased (16% and 10%, respectively) and remained depressed for the entire recovery period. MMG RMS increased (20%) and returned to pre-stretching values within 15 minutes
suggests that	changes in visco	elastic parallel co	mponents recover after a f	few minutes.	force signals. Also, MMG R	MS returns to pre-stretching values whic tude are required.
Malek et al. (2011)	ACC	VM	10 healthy, males (age: 24.4±1.3 years)	MPF and amplitude o MMG and output power	f CE exercise effects on muscle's IZ	MMG amplitude was not influenced by IZ but MMG MPF changed depending on distal, IZ and proximal sensors on th muscle for each subject.
			subjects; ii) IZ does not ir of muscular fatigue withou		al from VM muscle during ntamination by the IZ.	CE.
Herda et al. (2010)	ACC	VL	5 RT (age: 23±3 years) 5 AT (age: 32±5 years) and 5 SED (age: 23±4 years); healthy males	RMS of MMG and sEMG, and force	Fiber type discrimination among three trainings	AT group had the highest percentage of type I fiber area, the RT group had the highest percentage of type IIa fiber area, and the SED group had the highest percentage of type IIx fiber area.
	unique. The log strategies.					oth the MMG RMS and sEMG RMS vs. force statically examining changes in the moto
Malek et al. (2010)	ACC and PIZ	VL and RF	9 healthy, collegeaged males (age: 23.6±0.8 years)	Output power, MMG amplitude and MMG MPF		CE exercise influenced similar effect or MMG amplitude but was inconsistent for MMG MPF for both sensors and muscle groups.
	ubject-by-subjec		ubjects; ii) MMG amplitude	e responses for both mu	iscles for incremental CE ar	e the same when comparing PIZ and AC
Taylor et al. (2010)	ACC	Thigh and shin	9 healthy subjects (4 males and 5 females, varying in height and weight)	Sample vs. acceleration	Monitoring correct exercise for knee osteoarthritis	The results obtained a reliable average accuracy (0.92, 0.97, and 0.90 respectively) and an acceptable average sensitivity (above 70%) of the standing hamstring curl, reverse hip abduction, and lying straight leg raise when performing within subject and across subjects cross validation.
patient to con	tinue exercise, a	nd report patient		an and/or care giver.Fu		d on the classifier decisions, motivate th ne this experiment with patients who ar
Malek et al. (2009)	ACC	RF	8 healthy males (age: 27.3±2.3 years)	Output power, and MMG amplitude and MPF	Knee extensor (KE) and CE muscle action	KE resulted in similar patterns of responses with CE for MMG amplitude of the composite data in all 8 subjects but MPF was inconsistent.
muscle.Future	work: Future stu	dies are needed t	o examine the motor cont	rol strategies of the qua	adriceps muscles for dynan	e of examining MMG amplitude for the R nic exercises and these should use the K cular fatigue during cycling.
McKay et al. (2007)	ACC	RF	10 healthy, moderately fit young males (age: 23.0±2.3 years)	RMS of MMG and sEMG, and normalized MMG amplitude over time	Exercise effect on muscle mechanical signal	Importantly, all subjects demonstrated an increase of MMG signal ranging fror 1.8 to 7.7 times of the pre-exercise leve
						e exercise and this may contribute to a vith alterations in muscle tone or atrophy
Cramer et al. (2007)	ACC	RF	10 females (age: 23.0 ± 2.9 years) and 8 males (age: 21.4 ± 3.0 years)	MMG and sEMG amplitudes, joint angle and pT	Stretching effect on muscle strength	pT, acceleration time, and sEMG amplitude decreased from pre to post stretching at 1.04 and 5.23 rad/s. Ther was no change in work, joint angle at pT, isokinetic range of motion, or MMC amplitude.

changes in muscle force production that could adversely affect performance.

Table 7. Cont.

Study	Sensors	Muscles	Subjects	Parameters	Assessment	Results
McKay et al. (2006)	ACC	RF	10 fairly healthy subjects (6 males and 4 females; age: 33±13 years)	MMG and work	Exercise activity	MMG and work was linearly correlated, non-exercised thigh showed half of MMG activity compare to exercised thigh, MMG activity was higher at shorter length of RF muscle.

Comment: i) Small sample size and only healthy subjects; ii) The greater MMG activity at shorter muscle lengths suggests that muscle that is less stretched could more freely oscillate, producing higher MMG amplitudes.

Future work: Further evidence is needed to examine that excess post-exercise resting MMG activity is likely neurally mediated.

doi:10.1371/journal.pone.0058902.t007

Strength assessment

Three studies examined muscle strength [59–61] (Table 4). Matta et al. [60] addressed the temporal (RMS) and spectral components of MMG signals from the BB muscle of males and females during different levels of contraction to characterize muscle strength. Another study by Marek et al. [61] focused on examining the short-term effects of static and proprioceptive neuromuscular facilitation stretching on muscle strength and output power. They concluded that both static and proprioceptive

neuromuscular facilitation stretching caused similar deficits in strength, power output, and muscle activation at both slow $(60^{\circ}/s)$ and fast $(300^{\circ}/s)$ velocities [61]. In addition, Ryan et al. [59] examined the inter-individual variability for the patterns of responses of MMG amplitude and MPF versus isometric torque from the VL muscle in lower-strength and higher-strength individuals. The authors indicated that the composite MMG amplitude versus isometric torque relationship was best fit with a linear model for the lower-strength group and a cubic model for

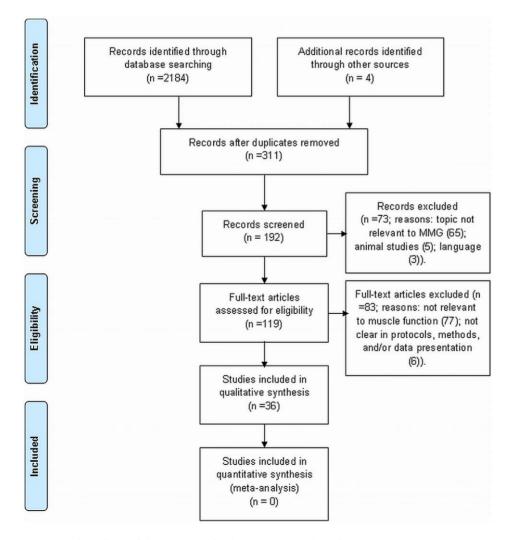


Figure 1. Flow chart of the process of selecting potential studies. doi:10.1371/journal.pone.0058902.g001

the higher-strength group [59]. They also found that the composite MMG MPF versus isometric torque relationships was best fit with linear models for both the groups [59].

Muscle balance assessment

One study included muscle balance measurement (Table 5). Armstrong et al. [31] evaluated the reliability of a protocol for using a microelectromechanical high-resolution ACC to measure centre of mass accelerations in the three cardinal planes (vertical, medial/lateral and anterior/posterior) and uniaxial ACC to measure MMG for the purpose of assessing balance and postural control. High resolution ACC and MMG offered reliable information pertaining to balance, and may have application in evaluating postural control and stability [31].

Muscle movement assessment

Seven studies [7,22,33,62–65] examined muscle activities due to movements as shown in Table 6. Scheeren et al. [64] investigated the functional movement of RF and VL muscles using MMG between healthy and spinal cord injured (SCI) patients during different functional electrical stimulation (FES) profiles. The authors found that the MMG signal was different between healthy and SCI patients but comparable in the RF and VL muscles per subject [64]. In addition, Krueger et al. [62] made a correlation between MMG signal and passive movements of healthy and SCI patients. The correlation found by the authors was positive for healthy subjects and negative for SCI patients [62]. Tian et al. [63] also observed different sEMG and MMG behaviours accompanied with age-related sarcopenia for elder and younger group collected from the VL muscle during concentric contraction with movement intensities of 45%, 60%, and 75%. The averages MMG RMS between groups were different for all movement intensities while sEMG RMS was indistinguishable between groups. sEMG MNF and MMG MNF increased with movement intensity among both the young and the elderly subjects [63]. The authors suggested that MMG should be used as an important tool in studying muscle contraction in age-related sarcopenia [63]. Yoshimi et al. [65] developed a new system to examine muscle activities and mandibular movement patterns during sleep bruxism (tapping, clenching and grinding). The system consisted of a dual-axis ACC and sEMG to record activities of the masseter muscle. The authors showed that grinding (59.5%) was most common, followed by clenching (35.6%) based on relative activity to MVC, whereas tapping was only 4.9%. They concluded that tapping, clenching, and grinding movements of the mandible could be effectively differentiated by the new system and sleep bruxism was predominantly perceived as clenching and grinding which varied between individuals [65]. Kawakami et al. [7] further investigated MMG and sEMG signals in the human lateral pterygoid muscle during mandibular movements for maximum voluntary clenching. They showed that the activity of the lateral pterygoid muscle could be evaluated by MMG signals recorded in the external ear canal if the jaw closing major muscles do not show active contractions [7]. Furthermore, Alves and Chau [33] designed and tested MMG signals during eyebrow movements to control a binary switch. They showed that the eyebrow movement MMG-driven switch performed with almost perfect sensitivity and specificity for all participants. The performance of their algorithm was robust against typical participant movements [33]. However, Scheeren et al. [22] characterized wrist movements like elbow extension and flexion, ulnar deviation and radial deviation. Their statistical analysis indicated that flexion was different from extension, ulnar and radial deviation, and radial deviation was different from ulnar deviation and flexion [22].

MMG measurement in exercises

Nine studies [8,37–39,44,66–69] reported MMG measurements of exercise. Table 7 depicts an overview of MMG effects examined for exercises. McKay et al. [39] performed recording of MMG signals to determine the effects of graded levels of exercise on ipsilateral and contralateral post-exercise resting RF muscle. They observed that MMG activity was greater when the RF muscle length was shorter (i.e. when the leg was extended versus flexed). This result suggested that less stretched muscles could more freely oscillate, producing higher MMG amplitudes [39]. Again, McKay et al. [69] examined MMG signals from resting muscles before and after resistance exercises. They found that resting MMG amplitudes increased about threefold after vigorous resistance exercise, and that the increase decayed exponentially over time. Conversely, resting muscle sEMG amplitudes doubled after resistance exercises, but their amplitudes were below the resolution of the measuring instrument [69]. Further, Herda et al. [67] utilized MMG signal to discriminate muscle fiber types during three training phases namely, resistance trained (RT), aerobically trained (AT), and sedentary (SED). The authors showed that there were differences in fiber type composition of the VL muscle among AT, RT, and SED persons [67].

However, Cramer et al. [38] investigated the acute effects of static stretching on neuromuscular functions (peak torque, work, joint angle at peak torque, acceleration time, range of motion, sEMG amplitude, and MMG amplitude) during maximal concentric isokinetic leg extensions in men and women. After stretching, the authors found that peak torque, acceleration time, and sEMG amplitude decreased from pre-stretching to poststretching at 1.04 and 5.23 rad/s; there were no changes in work, joint angle at peak torque, isokinetic range of motion, or MMG amplitude [38]. Moreover, Esposito et al. [37] evaluated the effects of stretching of the MG muscle on sEMG signal, MMG signal, and muscle force. They found that stretching may affect the mechanical properties of the muscle but no significant change was found in case of sEMG [37]. Another work by Taylor et al. [66] described an ACC-based system that can detect and classify small deviation from a correct exercise performance for knee osteoarthritis (joint disorder caused by pain and stiffness). This system allowed the possibility of quick recovery and prevention for the patients by taking full advantage of exercise secondary disorders [66].

Malek et al. [68] examined the MMG amplitude and MPF versus power output relationships for the RF muscle during cycle ergometry (CE) and knee extensor (KE) incremental exercises on the same subject. They demonstrated that the KE model expressed similar patterns of responses (best-fit with linear model) for absolute and normalized MMG amplitude of the composite data in all eight subjects, whereas for the CE exercise, these patterns varied on a subject-to-subject basis. In the analysis of MMG MPF, there were no consistent patterns of responses for CE and KE exercises involving the RF muscle [68]. Further, Malek et al. [44] compared ACC and PIZ MMG sensors for VL and RF muscles during incremental CE. They showed similar patterns of response for MMG amplitude but inconsistent responses for MMG MPF by both the sensors and muscle groups on a subjectsto-subject basis [44]. Malek et al. [8] however examined the effect on MMG responses during incremental CE across innervation zone (IZ) of the VM muscle. They concluded in their findings that MMG signals during dynamic exercise were not influenced by IZ of the VM muscle [8].

Discussion

This review summarizes the findings of MMG in measuring diverse MFs. The main findings of this review are as follows: First, we find sufficient studies that MMG may be used to measure different conditions of MFs including muscle fatigue, strength, and balance. Second, this review provides sufficient evidence that MMG may be used to examine muscle actions due to movements, even for patients with SCI. Third, we also find sufficient studies to show that MMG is able to monitor muscle activities under various types of exercise paradigms. Fourth, this review reveals an important issue that all of these studies, except one [56] (Table 1 to Table 7), have been conducted on small samples of healthy subjects only. For medical diagnostic purposes, comparisons would be needed with well-defined samples of neuromuscular patients. Finally, since we included studies that had a proper data presentation, clearly verified protocols and thoroughly demonstrated research methodologies, we believe that there is a little risk of bias across studies.

Fatigue or strength assessment

As mentioned previously, MMG provides a platform for muscle fatigue, and strength assessment. In most cases, researchers consider MMG amplitude, MPF, torque and contraction force to measure fatigue [15,51,54,55], and strength [59-61]. However, Al-Zahrani et al. [56] left caution of using RMS, MPF, and MDF for fatigue measurement between days due to the low number of smallest detectable difference. They used intraclass correlation coefficients (ICC) instead [56]. Xie et al. [21] explored fatigue MMG signals using embedded and correlation dimension parameters and advocated the use of nonlinear dynamics theory (Volterra-Wiener-Korenberg model and noise titration approach). Armstrong [29] performed intensity analysis using Morlet wavelets of MMG signal to determine postural control and fatigue. However, Krizaj et al. [53] claimed maximum displacement and half relaxation time as parameters to measure muscle fatigue. On the other hand, the authors showed supporting evidence for using EME as a parameter to measure muscle fatigue [14,57]. The choice of parameters used for muscle fatigue measurement differ possibly due to the various set of protocols considered, use of different MMG sensors or selection of different muscles. Nevertheless, all of these studies agreed that MMG may be implemented as a measurement tool for monitoring muscle fatigue. However, all but Al-Zahrani et al. [56] examined muscle fatigue using a small sample size which were confined to healthy subjects only.

Movement activity or balance assessment

Based on the studies reviewed, MMG appears to be an effective means of measuring muscle balance, and activities due to movement. Researchers in [7,62-65] allowed MMG RMS amplitude and MNF as the parameters to examine muscle activities of movements. However, Scheeren et al. [22] analyzed zero crossing, peak counting and RMS of MMG signals to characterize wrist movements. The results from their studies suggest that MMG may be capable of measuring muscle movement activities caused by either SCI or age-related sarcopenia, and muscle balance of quadriceps. In addition, MMG may also be useful to differentiate mandible movements during sleep [65], and voluntary clenching tasks [7]. Alves and Chau [33] also detected eyebrow movements using MMG with high accuracy. All of these studies confirm that MMG may be used to examine movement activities of different muscles. On the other hand, Armstrong et al. [31] conceded that ICC besides the commonly used MMGp-p amplitude, could be chosen to characterize muscle balance. However, all these assessments used a small sample size of healthy subjects.

MMG in exercise assessment

We have found studies which include MMG measurement to examine muscle activities of exercises. This review reveals that stretching may affect the response of MMG signals. The authors in [38,39], for example, clearly showed the effects on MMG amplitude for the RF muscle after stretching. Further, Esposito et al. [37] found that stretching may affect the mechanical properties of the MG muscle. However, Malek et al. [68] demonstrated that there is a linear response between MMG and knee extensor exercises for all participated eight subjects, but the MMG response was influenced on a subject-to-subject basis for CE exercises involving the RF muscle. Again, Malek et al. [44] determined that MMG amplitude responded in similar patterns using PIZ and ACC sensors from VL and RF muscles on subjectto-subject basis. This subject dependent MMG response during CE may be due to varying muscle fiber composition, and different force labels production between subjects. Further, McKay et al. [69] demonstrated that the resting RF muscle affected MMG signals before and after resistance exercises. Furthermore, Taylor et al. [66] implemented and studied the effect of exercises on MMG to monitor the correct amount of exercise required for knee osteoarthritis subjects. However, Herda et al. [67] analyzed the effects on MMG RMS of the VL muscle during AT, RT, and SED and used these to identify muscle fiber types resulting from the three training phases. On the other hand, Malek and Coburn [8] found no influence on MMG response during incremental CE exercises across the IZ of the VM muscle. This result suggests that MMG signal from the VM muscle during CE exercises may be used to study muscle condition without regards to signal contamination by the IZ. Thus, this review reports that MMG may be applied as a useful tool to monitor muscle activities for stretching or exercising. However, all of these studies only conducted the assessments using a small sample size of healthy population.

Limitation

This review comprises several strong points, including its uniqueness. To date, this is the first study specially designed to retrieve, analyze and critically appraise existing trends of MFs assessment based on MMG. There are nevertheless some limitations in this study. We included studies which still suffer from limited sample size, poor characterization of subjects and the heterogeneous methodology. We also did not include non-English studies in our analysis. On the other hand, lower quality of trials not published in English may also introduce bias [70]. In addition, a small amount of publication bias could also be present due to the bounded time frame (2003-2012) used for article searching. This bias can be neglected because technology was much less advanced in earlier years and can hardly be compared to approaches used in later studies. Overall, the information documented by this article may be useful to future researchers in understanding the existing status on the use of MMG for monitoring MFs.

Conclusions

In summary this review reveals that MMG may be applied as a useful tool to examine muscle fatigue, strength, and balance. We also find sufficient evidence that MMG may be used to evaluate muscle activities of movements. In addition, this review also shows that MMG may be a useful tool to monitor muscle activities during, after or before exercises. However, we observe that of

these 36 studies, only two studies performed analyses using neuromuscular patients but still with a small sample size, and only one examined with a reliable sample size that is also confined to a healthy population only. Therefore, future work is needed to examine MMG for MFs in a sufficient number between healthy subjects and neuromuscular patients.

Supporting Information

Table S1 Keywords and search strategies for MMG in measuring muscle function.

(DOC)

Table S2 Data extraction form for MMG in assessing muscle function.

(DOC)

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Acknowledgments

We thank Sebastian Sundaraj, MD, Malaysian Ministry of Health, for his assistance.

Author Contributions

Conceived and designed the experiments: MAI KS. Performed the experiments: MAI KS NUA. Analyzed the data: MAI KS RBA. Contributed reagents/materials/analysis tools: NUA. Wrote the paper: MAI KS.

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