



AALBORG UNIVERSITET  
STUDENTERRAPPORT

# Simultaneous and proportional control of reaching and grasping

P7 Masterproject - Autumn 2017

Gruppe 17gr7404



# Abstract

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# Preface

This project Morbi luctus, wisi viverra faucibus pretium, nibh est placerat odio, nec commodo wisi enim eget quam. Quisque libero justo, consectetur a, feugiat vitae, porttitor eu, libero. Suspendisse sed mauris vitae elit sollicitudin malesuada. Maecenas ultricies eros sit amet ante. Ut venenatis velit. Maecenas sed mi eget dui varius euismod. Phasellus aliquet volutpat odio. Vestibulum ante ipsum primis in faucibus orci luctus et ultrices posuere cubilia Curae; Pellentesque sit amet pede ac sem eleifend consectetur. Nullam elementum, urna vel imperdiet sodales, elit ipsum pharetra ligula, ac pretium ante justo a nulla. Curabitur tristique arcu eu metus. Vestibulum lectus. Proin mauris. Proin eu nunc eu urna hendrerit faucibus. Aliquam auctor, pede consequat laoreet varius, eros tellus scelerisque quam, pellentesque hendrerit ipsum dolor sed augue. Nulla nec lacus.

# Indhold

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# 1 | Background

## 1.1 Anatomy of the lower arm

In this paper/project there will be a focus on the lower arm as the Myo armband will be used extract information from this part of the body. The anatomy of the lower human arm will briefly be described in this section along with a description of relation between lower arm muscles and hand movements for selected gestures.

The lower human arm is designed to give humans a manoeuvrability and dexterity to coordinate and execute complicated and precise hand and finger movements with ease.

(something about the number of DOF's in the human arm, and what we define as 1 DOF. Movement in one axis)

This skill is achieved through the use of several muscles which intertwine and make synergies to perform all the different gestures of the hand [jiang2009] [avella2006]. Muscles in the lower arm is arranged in layers, having an outer, middle and inner layer. These muscles are used to rotate the forearm and hand, flex and extend the hand at the wrist as well as adduction and abduction, of both the wrist and fingers. The muscles control extension and flexion of the fingers at each separate joint and the movements of the thumb.

NEW PICTURE ABOUT DOFS INSTEAD

The aim for this project is to translate pronation and supination along with extension and flexion of the wrist via EMG signals to control a robotic arm. Therefore, only selected muscles will be relevant to further investigate.

(PICTURES DEPICTING supination and pronation adduction and abduction and flexion and extension)

Therein exists a problem in detecting viable EMG signals to properly detect pronation and supination gestures, since the muscles involved does not extend through the forearm as most other muscles in the forearm.

REWRITE TO FOCUS ON EXTENSION AND FLEXION OF WRIST INSTEAD OF FINGERS

## 1.2 Origin of electromyography

write head: head also make sure Martin is not lying about origin of the EMG signal (motor unit action potential VS calcium release from the SR)

The electric potential detected with electromyography is an action potential causing the muscle to contract. Certain mechanisms are involved for this to happen. The motor unit of the muscle needs to be activated alongside with its associated alpha motor system, which is the lower motor neuron, its axon, and the muscle fibers the motor unit innervates. The muscle fiber is an excitable cell with a resting potential of between -90mV and -70mV. A threshold of approximately -55mV needs to be reached for an action potential to be generated. The sarcolemma, the membrane covering the muscle fibers, has sodium and potassium ion channels that maintains the resting potential, depolarize the muscle fiber if the threshold is exceeded or repolarize the muscle fiber. [cram2012]

ADD picture of AP threshold

The lower motor axon is branching out so that it can attach to the muscle fiber at the motor end-plate and create neuromuscular synapses. The action potential traveling down the axon reaches the synapses and releases Acetylcholine (ACh). ACh raises the permeability of the cell membrane where sodium ions influx and causes the membrane to depolarize. Calcium ions are released and binds with troponin and exposes the active sites on the thin filaments which allows the muscle to contract. The action potential travels along the whole muscle fiber through t-tubuluses. This happens in both directions from the motor end-plate to the tendentious attachment. When the peak of the depolarization of about 30mV is reached a rapid efflux of potassium ions causes the muscle fiber to repolarize and reach its resting potential again. [cram2012]

ADD picture of the "possible"AP moving across the muscle membrane towards the tendons

Depending on the force that needs to be applied for a given task more or less motor units are activated and therefore more or less muscle fibers are contracted. The bigger the force the more motor units are activated. Furthermore, the number muscle fibers per motor unit varies between muscles in the human anatomy. The finer the movement the higher the innervation, e.g. the extraocular muscle has the highest innervation of 3:1 and the gastrocnemius muscles has one of 2000:1. [cram2012]

(Something about how the innervation is in certain muscles of the forearm. Also argue that humans can perform more dexterious movement when the ratio of muscle fibers to motor units is low) (maybe around 100:1) (something about how the EMG signal is affected when the arm is positioned differently)

## 1.3 Electromyography acquisition

The following section will contain an explanation of the main component of acquiring EMG signals using surface electrodes.

When acquiring EMG signals the electrodes act as a transducer by converting the differences in ion distribution on the skin surface caused by ion exchange under muscle activity,

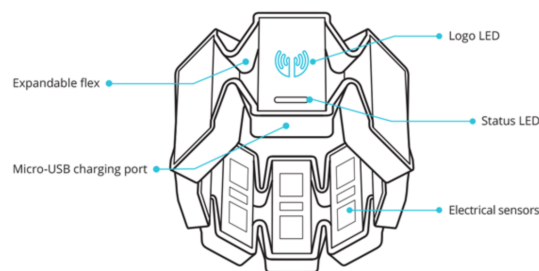
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into an electric current. Surface electrodes used to acquire EMG signals come both with and without gel covered surfaces, where the Myo armband employs dry electrodes. Using dry electrodes will often be more practical in use, while the gel covered electrodes will acquire more exact readings of the signals. [lee2008] [cram2012]

The most commonly used electrodes for EMG are made of disposable silver-impregnated plastic, and in order to keep the electric potential on the skin surface stable and reduce impedance between the surfaces, they are often covered in a silver chloride gel. Using dry electrodes will result in a higher surface impedance, which means that the signal contains more noise compared to a gel covered electrode. However, when using dry electrodes the skin will itself provide a “gel” by sweating which will increase readings and decrease the impedance. [cram2012]

### 1.4 Myo armband

Myo armband is a interactive gesture system developed by Thalmic Labs capable of identifying the movements of hand and arm in order to interact and control different electronic devices.



**Figure 1.1:** Main components of the Myo armband. []

The Myo armband has eight medical grade stainless steel EMG sensors, responsible for recognizing each gesture. In addition, it has a nine axis inertial measurement unit (IMU) which enables the detection of arm movement. The IMU includes a three axis gyroscope, a three axis accelerometer and a three axis magnetometer. An IMU is an electronic device that provides information concerning position and orientation for navigation and stabilization purposes. The magnetometer has the property of measuring magnetism. (something about the actual data the myo band provides and how many axes a magnetometer actually has). The accelerometer measures the physical acceleration experienced by an object, where the object in this case is the body part where the Myo armband is placed. It gives information about the acceleration experienced relative to free fall and expresses this in g-force. One g-force being when the accelerometer is at rest on the Earth's surface. That is since all points on the surface of the Earth are accelerating upwards relative to an object in free fall near the surface. For the g-force to change from one g-force the

accelerometer must be exposed to motion. The gyroscope has the property of measuring angular velocity. **SOURCE**

The Myo armband is capable of pulling sEMG data at a sample rate of 200Hz while the remaining data (accelerometer, gyroscope and magnetometer) is pulled at a sample rate of 50Hz. Thus, the Myo band arm supplies two kinds of data, which is spatial and gestural. The spatial data provides information about the orientation and movement of the user's arm given by two data types: orientation and acceleration. These are provided through the accelerometer and gyroscope. Gestural data provides information about the user's hand gestures and is provided through EMG recordings. The recorded signals can be sent to other devices using Bluetooth 4.0.

## 1.5 JACO<sup>2</sup> robotic arm

In this section a brief description of the JACO<sup>2</sup> robotic arm will be given. It is a 6 DOF robotic arm with a three-fingered hand developed by Kinova Robotics. It is lightweight (4.4kg), which makes this machine specially usable in assistive and collaborative applications. It is designed to help people with upper body disabilities in order to gain more autonomy in ordinary daily tasks.



**Figure 1.2:** 6 DOF JACO<sup>2</sup> robotic arm from Kinova Robotics. [kinova webpage]

**new more exciting picture of the same thing**



The JACO<sup>2</sup> is a serial manipulator, which means that this kind of robotic arm is designed as a series of links connected by motor-actuated joints that extend from a base to an end-effector. Any movement in a joint affects all the following joints and links in the chain. The arm can by default be controlled with the help of a joystick, but it can be programmed in C++ to be controlled by other means, using the software development kit (SDK) provided by the manufacturer.

**include picture of JACO arm with all the names of things on/in it.**

## 1.6 Preprocessing of EMG

In order to achieve a higher signal to noise ratio (SNR) it is common practice to implement some preprocessing methods, including input impedance, differential amplification and filtering. The raw EMG signals has to be preprocessed due to them being sensible to noise elements from the surroundings, since the range of the signal is in the order of millivolts to microvolts.[cram2012]

Input impedance is determined by a simple rule in order to avoid defeating the common mode rejection of the EMG amplifier. The rule states that the input impedance of the EMG amplifier has to be between 10 and 100 times higher than the impedance of the skin-electrode interface.[cram2012]

Differential amplification is used in EMG in order to amplify the original signal and remove common signals from two or more electrodes, in order to avoid common noise from more electrodes in the amplified signal. The amplifier must have a build in gain as well , which determines the final strength of the signal, and both of these features are implemented in order to avoid the SNR.[cram2012]

Basic filtering should be implemented in order to avoid electrical noise (50Hz). This filter would be implemented as a notch filter, in order to reject the electrical noise and achieve a higher SNR. Furthermore the filtering should include a bandpass filter with a bandwidth chosen depending on where the EMG is performed. This is done in order to make sure the final signal doesn't contain irrelevant high and low frequencies.[cram2012]

**add stuff about the bandwidth of the EMG signal (5-500Hz), the implementation of a high-pass filter to avoid low frequencies from e.g. movement artefacts, not implement a band-pass filter bc the Myo armband only detect between between 0-100Hz, and therefore the highest frequencies we will ever detect lies within the EMG bandwidth.**

## 1.7 Feature extraction

Following preprocessing of the recorded EMG signal, features can be extracted and used to map different hand gestures. When analyzing EMG signals there will be three different signal components to be extracted, which are the frequency and time domains, as well as the time-scale representation. Frequency domain features require a Fourier transformation of the signal, which requires more processing than the direct extraction of time domain features. [phiny2012]

Based on the study of Hahne et al. [hahne2014], we will choose logarithmic variance as the feature to be extracted from the recorded EMG signal. Hahne et al. finds that the cross-validation performance improves significantly with the use of linear regression combined with logarithmic variance, compared to combining the linear regression with variance or RMS. [hahne2014].

## 1.8 Regression methods

Regression methods are widely used in statistics as a method to determine relationship between variables. It can be used to extract relations to predict future developments or tendencies in a given data set. It is also a commonly used method to evaluate EMG signals to determine different parameters.

The most basic form of regression is linear regression, which is a test for linear dependency between two variables. In simple linear regression it is investigated how one, dependent variable, is related to another, independent variable. The term *simple* denotes that only two variables are being considered simultaneously. The equation for simple linear regression is: [zar2009]

$$Y_i = \alpha + \beta X_i \quad (1.1)$$

Performing simple linear regression finds the correlation between the tested variables, and is expressed by the correlation coefficient. This coefficient describes how the two variables relate to each other by how the development of one variable is dependent on the other. Thus a positive correlation represents that a change in one variable will result in a similar change in the other variable as well. On the contrary, a negative correlation implies that change in one variable will result in an opposite change in the other variable. If no correlation is present between the two variables no change in either variable will result in change in the other, and it can therefore be determined that the two variables have no relation to each other. [zar2009] The simple correlation coefficient is calculated as: [zar2009]

$$r = \frac{\sum xy}{\sqrt{\sum x^2 \sum y^2}} \quad (1.2)$$

Furthermore a coefficient of determination can be calculated to express how much of the variability of the dependent variable is accounted for when regressing upon the independent

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dent variable. This coefficient is denoted  $r^2$  and can be calculated by simply squaring the correlation coefficient ( $r$ ). Both  $r$  and  $r^2$  can be used to determine the strength of the relationship between the two tested variables. [zar2009]

A variant of the linear regression is the multiple linear regression, which can be used in cases where the relationship between three or more variables is wished to be investigated. Here it is considered that one of the variables are dependent on two or more independent variables. Multiple linear regression can be used in cases where two or more variables are expected to have a linear correlation to a dependent variable and it is wished to find which of the independent variables who has the biggest influence on the dependent variable, so to say the highest correlation coefficient. Since multiple linear regression is based upon simple linear regression, it is modelled after the equation for simple linear regression. However, as  $Y$  can be dependent on more than one other variable at times, another can be added to the equation: [zar2009]

$$Y_i = \alpha + \beta_1 X_{1i} + \beta_2 X_{2i} + \epsilon_i \quad , \quad (1.3)$$

, where the sum of the error ( $\epsilon$ ) is zero and is assumed to be normally distributed.

When three variables are present in the equation, the visual representation of the regression is in the 3rd dimension, and will no longer be presented as a line in 2D, but as a plane in 3D. Having more than three variables will resolve in a regression in the  $m$ -dimension, where  $m$  is the number of variables. This plane of regression is called the hyperplane. However, regression is not a perfect fit to every sample point, and thus the equation for three or more variables is only complete when the error is also calculated, denotes as  $\epsilon$ .

There exist ofcourse cases where the relationship between more than three variables is wished to be investigated. In such cases, each new variable can be added to the equation, and the final can be expressed in a summed up equation: [zar2009]

$$Y_j = \alpha + \sum_{i=1}^m \beta_j X_{ij} + \epsilon_j \quad , \quad (1.4)$$

where  $m$  is the number of variables.

There exist no limit to the number of variables which can be tested, however there should always be at least two observations more than the number of variables, so that  $n \geq m + 2$ . Otherwise multiple linear regression is not possible. [zar2009]

