A Novel Musculoskeletal Imbalance Identification Mechanism for Lower Body Analyzing Gait Cycle by Motion Tracking

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Abstract—Muscles in a human body consists of a pair. Musculoskeletal imbalances caused by repetitive usage of one part of the muscle in this pair and incorrect posture a human body takes on regular basis lead to severe injuries in terms of neuro musculoskeletal problems, hamstring strains, lower back tightness, repetitive stress injuries, altered movement patterns, postural dysfunctions, trapped nerves and etc. and both neurological and physical performances are severely affected when time progresses. In clinical domain, muscle imbalances are determined by gait and posture analysis, Movement analysis, Joint range of motion analysis and muscle length analysis which require expertise knowledge and experience. X-Rays and CT scans in the medical domain also require domain experts to interpret the results of a checkup. Kinect is a motion capturing device which is able to track human skeleton, its joints and body movements within its sensory range. The purpose of this research is to provide a mechanism to identify muscle imbalances based on gait analysis tracked via Kinect motion capture device by differentiate the deviation of healthy person’s gait patterns. Primarily, the outcome of this study will be a self-identification method of human skeletal imbalance.

Index Terms—Gait cycle, Imbalance, musculoskeletal system, Graph comparison.

I. INTRODUCTION

To function properly as individuals, it is important to endow a healthy and a strong body. In order to provide the body with shape, protection and internal structure, human skeleton is a necessary component and for human skeleton to function, support of skeleton muscles is crucial. Human body consists muscles which mostly work as pairs to assist these functionalities. A muscle imbalance can be defined as one muscle from the pair getting stronger, longer and stiffer than the other. For the proper utilization of muscles, muscle balance is a vital concern. Disorders in the musculoskeletal system is an important health problem to the general public considering the sickness absence, work disability and health care cost. Since the human skeleton cannot be accessed directly like skin, hair or nails and a daily care routine cannot be carried out on the surface level, we have to gain professional consultancy to identify the ‘what could go wrongs’ pertaining to the skeleton system and answer the identified issues in a proper manner for its wellbeing.

The relationship of the lower body skeletal system is at a stronger rate than the upper body skeletal system. Therefore, higher injury rates are associated with the lower body [4], [5] and applicability of this study to the upper body will be determined only if the approach can be applied to the lower body. Gait analysis is a new biometric technique which can be used to identify behavioral specifics of different people [6]. Usage of marker less systems is a technique which does not need physical contact between sensor and the subject to observe the gait cycle. Gait analysis is advantageous in allowing marker free identification, hard imitation and inability of hiding the postural patterns.

Considering marker-free systems, (i.e., no sensors or other devices are placed on the subject), gait recognition is an unintrusive technique, meaning that no physical contact between subject and measurement device is necessary. In marker-free gait recognition, person identification is usually executed by analyzing video sequence recordings [25]. According to recent cites Microsoft Kinect which is originally used as a video gaming device can be also used as a tool to track human gait variable as well as gait kinematics. Kinect is capable of tracking and recording 3D human motion without using markers [7], detects human motions in 3D view real time and extract artificial skeleton with joints overtime.

A. Clinical analysis mechanisms

- Gait cycle Analysis
Gait cycle, primarily can be defined as the way a human walks; the cycle of phases from the initial contact of one foot with the ground and the next contact of the same foot with the ground. In gait analysis, physiotherapist observes the gait of an individual, analyses gathered information by comparing with standards and predicts the condition of the muscle. Gait cycle can be divided into two phases; stance and swing. A walkway of at least six meters or a treadmill is used to perform gait assessment. There is no one correct manner of assessing the gait and the best time to examine a patient’s gait cycle is as they enter the examination room since they walk in naturally [3]. The following figure shows the events of a complete gait cycle.

Fig.1. Gait cycle phases

B. Movement Analysis

In movement analysis, a patient is requested by the physiotherapist to perform various activities to determine whether the patient holds a musculoskeletal imbalance or not by analyzing the behaviors and stances the patient’s body takes. Requested stance is highly depended on the experience and knowledge of the observer. There are three main methods of movement analysis; movement phases, free body diagrams and deterministic models. In movement analysis phase, analysis of preparation, execution and follow-through is analysed. In preparation phase, movement preparation by the individual to perform a particular motion is analysed and in the execution phase, movement of the patient is analysed. All the behaviors of the individual after the movement is also analysed in this phase.

C. Joint Range of Motion Analysis

In joint range of motion analysis, the range a human can perform his motions and movements is taken to consideration. Main considerations in this approach are; the plane of the movement occurrence, muscle used to produce the movement, function of the involved muscle; agonist [14]. There are mainly four planes a human body can be divided into;

In this analysis method all mentioned planes and axis and both active and passive range of motions are measured [14] and with the aid of Goniometer angles between the joints are measured and compared with the standard angles defined in the domain with respect to the person’s age, weight, fat element. A noticeable deviation of joint angles from the standards is determined as a muscle imbalance.

D. Muscle Length Analysis

Muscle length is analysed against the age and other physical parameters of the person which assesses the resistance to passive movement. In order to gain accurate result, muscle length should be performed when the patient is not in acute pain in order to avoid pain inhibition and muscle guarding [15]. Goniometer or a tape can be used to do the measurements and there are four steps in performing muscle length analysis [16].

- Ensure maximal lengthening of the muscle from origin to insertion
- Firmly stabilize one end (usually the origin)
- Slowly elongate the muscle
- Assess the end feel

E. Technical Analysis Mechanisms

- Electromyography

A needle is injected to the surface level of the human body and this stimulation is used to measure the reaction and activities of muscles to the mentioned electrical stimulation. Muscle activities grasped by the electrodes are displayed in a monitor called oscilloscope and an audio amplifier is also used to listen to the muscle activities. To determine a muscle imbalance, currently consultants analyse these muscle activities and their responses to the electric stimulation and a muscle imbalance is determined if found.
In the IT domain researchers have done studies to identify muscle abnormalities using motion tracking sensors. In many studies they have considered sports domain to identify musculoskeletal issues since sports persons are often having issues in musculoskeletal system. Characteristics of the range of motions of the musculoskeletal system, muscles at risks and injury prevention strategies have been identified by using 3D motion tracking systems in a previous researches [3]. A nine-camera, 3D motion capturing system and 42 reflective markers on subject’s each part of the body were used to track body movements and to identify muscles at risk. Using the raw 3D data captured from the nine-camera and 42 reflective markers, biomechanical modeling of the subject is produced and muscles and risks have been identified using this biomechanical model. Inertial tracking sensor which combines the signals from 3D gyroscopes, accelerometers and magnetometers and estimate the free orientation of human have also been used in previous studies [14].

When calculating human kinematics, it is required to define all joint orientation in its local frame so that local orientation can be easily converted into the angular values of each joint of musculoskeletal system [5]. In the inertial sensor, each individual sensor of the system provides orientation with respect to the global frame. The MVN motion capture system is consisted of body worn sensors which are having unique approach to estimate body segment orientation and position changes by integration of gyroscope and accelerometer signals which are continuously updated by using the biomechanical models of the human body which allows to track the human musculoskeletal system’s motions [14].

Using biomechanical model which assumes that a subject’s body includes body segments linked by joints and that the sensors are attached to the subject’s body segments, the inertial navigation system kinematics are translated to body kinematics. When calculating the joint angles, the origin values are defined in the center of the functional axis with the directions of the X, Y and Z related to the functional movements. MVN MotionGrid is an ultra-wideband based tracking technology complementary to the MVN system which is added a local GPS system to the sensor and capable of assessing all the kinematics of an athlete accurately even during high centripetal accelerations [14].

Kinect, a markerless technology has been used to study the precision in the joint angles computation against a professional optical motion capturing device. The researches have obtained a guaranteed range of disparities to make validations on the used two devices regarding joint angles when the limbs are involved [18]. Motion tracking devices as in Kinect since it is relatively a cost effective motion capturing device, introduces the possibility of changing paradigms based on complex and expensive technologies and devices in the biomechanical domain [19]. Human musculoskeletal motions can be tracked using Kinect in model-based and appearance-based approaches [19]. In model based approach, it provides a continuum of solutions which are costly and
also depending on the wealth of visual information provided by a multi camera system. When it comes to appearance-based method, it is associated with much less computational cost and the complexity of hardware is very less. This model [19] minimizes the inconsistency between the 3D structure and appearance of hypothesized 3D model and the actual visual observation comes from the Kinect sensor.

When tracking the human motions using Kinect, it is possible to acquire images using the sensor with its accompanied depth map [20]. Skin color of the human body section can be detected followed by depth segmentation and also this is used to capture the 3D image of particular body segment. In a previous research[20] human hand has been tracked using the Kinect. In order to model each hand pose they have used 27 parameters represented as vectors. In order to quantify the inconsistency between hand hypotheses and the actual observation, it is possible to use graphics rendering techniques to compare skin and depth maps for a particular hand pose.

C. Gait cycle applications

In recent studies human gait cycle has been used to denote different type of outcomes of an individual. Analyzing the human gait cycle is a new emerging trend in the research world for many applications such as human identification, neurological disease identification and fall detection of elderly people.

Individual human recognition by gait cycle has been performed [30] via Gait Energy Image (GEI) mechanism. GEI is a spatio-temporal gait representation for individual recognition by characterizing the human gait cycle properties which is represented in a single image while preserving temporal information. This representation saves both storage and computation time for recognition compared to binary silhouette [26].

In recent studies gait cycle parameters have been used to be predictive of future falls and adverse events in older people using Kinect [28], [29], [30]. Impairments in gait and balance causes falling of adults basically. Identification of these gait abnormalities is essential to early initiation of fall prevention strategy. By analyzing the stride time, stride symmetry, speed, age parameters of sample objects while they walking, previous research have found that accelerometers give accurate results of gait analysis of fallers and non fallers [30]. They have placed accelerometers in head, trunk and the lower body to capture the gait cycle characteristics. Not only accelerometers but in other study [32] microsensors have been used to track the gait cycle and send the status of gait cycle to aid station real time at the falling moment. This system is very powerful to capture, analyze and communicate results to remote place real time. Kinect sensor with a computer deployed in an apartment was used in another study to capture the gait cycle of older adults in the apartment and make predictions on their health situation [29].

Identification of neurological disorders of patients was conducted based on the support, Double support time percentage, Single support time percentage, Step-length, Step-time, step-width, Stride-length, Stride-time, and Swing-time characteristics of gait cycle [27].

This research group was capable of identifying the gait variability of each neurologic patients for future prediction. By analyzing these characteristics, the certain disease was identified.

III. RESEARCH DESIGN

After the literature survey about the technical aspect and the research approach to the problem, what we understood was, analyzing the gait cycle is very emerged area in recent researches and using sensors and motion tracking devices to identify gait cycle is a trend in researches. But not one have conducted a research to identify musculoskeletal imbalance by analyzing the gait cycle. Hence our solution is analyzing human gait cycle to identify musculoskeletal imbalance of lower body using motion tracking device Kinect. Chapter III describes the design of the solution.

A. Data gathering and sampling methodology

- Sample selection

The sample of this research is consisted of both men and women. The male subjects fall between the age range of 25 – 45. The female subjects falls between the age range of 30 to 50. This age limits are chosen as these ranges falls between skeletal cycle completion and depreciation periods [21]. The subjects of the sample were having normal BMI value of 18.5 – 23 which indicates the BMI of a healthy person [22] and normal step size 5cm – 10cm which is the step size of a person who falls under the age ranges specified [22], [23]. Individuals having diseases which affect the gait cycle have not been included in the sample of this research. The sample was selected with supervision of domain experts and subjects who suffers from musculoskeletal imbalances were used in this research to prove the accuracy and reliability of the proposed methodology of analyzing muscle imbalances. We provided written consents to the sample prior to their participation in the experiment as it is the ethical way of doing human based experiments.

- Data gathering

Prior to capturing the individual gait cycles, user details of the subject were fed through the initial interface of the application. User name, age, height, weight, gender and number of gait cycles which is going to be tracked are the data fed into the system. In order to increase the accuracy of the process, more than one gait cycle was always captured. Followed by the initial user detail fed, capturing the human skeleton and its movements were proceeded.
B. Mathematical model to capture joint angles from the Kinect

In order to calculate the angles between the joints (hip, knee and ankle) using the captured joint points from the Kinect, following mathematical model was used.

Fig.3. Three joint angles in lower limb

Hip, knee and ankle joint angles are denoted by P, Q and R. Dot product function which is the standard way to calculate the angle between two vectors in 3D space in mathematics is used to calculate the joint angles in 3D space.

Dot product function which calculates the angle between two vectors in 3D space is used in this research to calculate the relevant angles in the research.

$$\text{Dot product} \ (PQ, QR) = |PQ||QR| \cos \phi$$

Step 1

Join the three related joint consider and create two vectors in 3D space

Example: If we consider three joints are P, Q, R then two vectors are PQ and QR

Let us assume the x,y,z coordinates as follows

\[ P = (x_1, y_1, z_1), \ Q = (x_2, y_2, z_2), \ R = (x_3, y_3, z_3) \]

\[ PQ = Q - P \rightarrow 1 \]

\[ QR = R - Q \rightarrow 2 \]

1. \(PQ = ((x_2-x_1), (y_2-y_1), (z_2-z_1)) \rightarrow \text{Lets say} (X_1, Y_1, Z_1)\)

2. \(QR = ((x_3-x_2), (y_3-y_2), (z_3-z_2)) \rightarrow \text{Lets say} (X_2, Y_2, Z_2)\)

\[ 1^2 + 2 \rightarrow PQ, QR = (X_1)(X_1) + (Y_1)(Y_2) + (Z_1)(Z_2) \]

Step 2

Since, \(PQ = (X_1, Y_1, Z_1)\) and \(QR = (X_2, Y_2, Z_2)\)

\[ |PQ| = \sqrt{(X_1)^2 + (Y_1)^2 + (Z_1)^2} \]

\[ |QR| = \sqrt{(X_2)^2 + (Y_2)^2 + (Z_2)^2} \]

Thus,

\[ \phi = \arccos \left( \frac{(X_1)(X_1) + (Y_1)(Y_2) + (Z_1)(Z_2)}{\sqrt{(X_1)^2 + (Y_1)^2 + (Z_1)^2} \sqrt{(X_2)^2 + (Y_2)^2 + (Z_2)^2}} \right) \]

C. CSV file generation

When a subject walks in a straight line, the Kinect sensor would capture all the body joints and the application is developed to record and calculate the lower limb body joint angle values in each phase of the gait cycle. Hip, knee and the ankle angle values of both right and left side in every 200ms is written to a .csv file and stored in the system. Number of .csv files which are generated is equal to the number of gait cycle values given in the initial data fed.

D. Gait cycle graph

Gait cycle graph represents how the joint angles change throughout one gait cycle. This graph can be drawn mainly in three different ways when it comes to lower limb musculoskeletal system; graph for hip variation in gait, graph for knee variation in gait, graph for ankle variation in gait. Gait cycle graph represents the angle of a particular joint in each phase of the gait cycle. X axis denotes the percentage of the gait cycle as 10%, 20%... 100% and Y axis denotes the angle of the particular joint. The time taken to complete a gait cycle by a healthy person is around two seconds. Hence it captures the joint angle values in each 200 milliseconds by the application which denotes 10% of the gait cycle. In order to generate this graph, joint angles in each phase of the gait cycle were captured with the aid of the application developed. The graph is then generated using the angle values in each stage of the gait cycle.

- Knee gait cycle graph

Knee gait cycle graph denotes how the knee joint angle is changed throughout each phase of the gait cycle. How the knee joint angle changes throughout the time of the
gait cycle is drawn in knee gait cycle graph. In this graph, x axis denotes time and the y axis denotes the angle of knee joint.

- **Hip gait cycle graph**

Hip gait cycle graph denotes how the hip joint angle is changed throughout each phase of the gait cycle. How the hip joint angle changes throughout the time of the gait cycle is drawn in hip gait cycle graph. In this graph, x axis denotes time and the y axis denotes the angle of hip joint.

- **Ankle gait cycle graph**

Ankle gait cycle graph denotes how the ankle joint angle is changed throughout each phase of the gait cycle. How the ankle joint angle changes throughout the time of the gait cycle is drawn in ankle gait cycle graph. In this graph, x axis denotes time and the y axis denotes the angle of ankle joint.

E. **Generation of the standard gait cycle graph**

In order to draw the standard gait cycle graphs for hip, knee and ankle, a healthy sample is taken for the experiment. The sample is consisted of 10 male subjects and 10 female subjects. Hip, knee and the ankle joint angle values are taken from the .csv file generated and separate three graphs are created. Data gathering is done three times for each individual to increase the data accuracy and the average value of these three is taken. All male gait cycle graphs of hip is drawn and the minimum and maximum threshold values are determined by analyzing those data. Female minimum and maximum threshold values are also calculated in the same way. Knee and the ankle standard gait cycles also generated by following the same procedure.

F. **Graph comparison to identify Imbalance**

When an undefined subject comes for the experiment, after gathering the initial details, particular number of gait cycles are tracked by the system. Number of gait cycles that is captured can be vary according to the necessary level of accuracy. After the angle values are written to .CSV file, the average hip, knee and ankle gait cycle values of the subject is calculated by the application itself. Creating hip, knee and ankle gait cycle graphs for both right and left side is the next step in the process. The created three graphs are then compared with the standard gait cycle graphs separately in order to identify whether the subject is having an imbalance in his lower limb and where the imbalance is.

IV. **CONCLUSION**

Previous identification of muscle imbalances is crucial for every individual to treat and overcome the situation in its early stages and avoid the occurrence of severe injuries. With the current mechanisms of identification lie many drawbacks. Muscle imbalances are not visible to the eye unless they rise with noticeable symptoms. Starting treatments for the imbalance in its latter stages will cause individuals to handle more developed neurological and physical dysfunctions.

A self-identification method is required in order to provide individuals with the ability to track their musculoskeletal system and treat it with proper care. Assessing muscle imbalances with the aid of technologies as in Kinect where human skeleton, gait cycle can be detected and by combining the medical domain with information technology and provide the physiotherapists and consultants with an aiding device, providing a self-identification mechanism for human body imbalances is the primary objective of this research.


[23] Orthopedic for rehabilitation


[27] "Gait Analysis in Neurological Disease", Smart patients, 2016


Authors' Profiles

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