

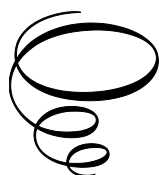
Enhanced Biometric Identification Using Photoplethysmography Signals

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By

Kim Ho Yeap, Chee Theng Chow,
Hui Tyen Low and Humaira Nisar

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PREFACE

Biometric identification stands out as a pivotal method for fortifying security measures, relying on unique bio signals characterized by subject-specific patterns intricate to replicate and contingent on the user's physical presence. This study pioneers a groundbreaking approach to secure authentication by harnessing photoplethysmographic (PPG) signals, recognized for their facile accessibility and cost-effectiveness. The proposed biometric identification method involves the extraction of PPG signals through an optical sensor, exploring the viability of PPG signals as an inherently distinctive biometric trait.

The research, involving biometric datasets derived from the fingertips of 40 healthy subjects, thoroughly showcases the efficacy of PPG signals as robust bio-measures for identification, particularly under controlled conditions with high-precision sensors. The comprehensive analysis includes extracting over ten thousand feature sets, with a randomly selected 30% subset utilized for identifications. Notably, the Support Vector Machine (SVM) model outperforms the Multilayer Perceptron (MLP) model, achieving an outstanding accuracy rate of 99.46%, a significant improvement compared to the approximately 98.11% accuracy attained by the latter. Setting the accuracy threshold at 75% proves successful in accurately identifying all participants.

This book details the completion of a project that developed a biometric personal identification system grounded in PPG signals, with a primary objective of augmenting security in critical sectors such as banking, military, and information technology. This initiative stemmed from the recognition of the inherent limitations associated with password-based security in the current landscape of advanced information technology, addressing concerns regarding password vulnerabilities.

The selected PPG signal, unique to each individual and obtainable as long as the person is alive, ensures the universal applicability of the system. This innovative approach not only enhances security but also tackles the intricate challenge of identifying twins with identical faces and DNA, underscoring the formidable difficulty in forging PPG signals. Despite its reliance on a relatively low-cost, straightforward circuit, the system guarantees high accuracy and reliability in personal identification.

The user-friendly design of the system, requiring no specialized information technology (IT) knowledge or technical skills, ensures accessibility for individuals across diverse age groups. Furthermore, the affordability of the system, as detailed in this book, amplifies its potential for widespread implementation in the fabric of human daily life, promising a paradigm shift in the realm of secure and accessible personal identification systems. This pioneering research, extensively detailed in this book, marks a significant step towards advancing biometric technology, offering a robust and user-friendly solution for secure personal identification in various sectors.

DISCLAIMER

In the course of composing the content of this book, the authors made use of ChatGPT to enhance its quality, clarity, grammar, and overall language proficiency. After utilizing this tool/service, the authors carefully examined and edited the content to ensure its logical coherence and appropriateness.

CHAPTER 1

INTRODUCTION

KIM HO YEAP, CHEE THENG CHOW,
HUI TYEN LOW, HUMAIRA NISAR

1.1 Background Study

In the dynamic landscape of modern automation, the imperative to establish a robust verification system transcends a mere strategic choice; it has become an indispensable necessity critical to upholding the security and reliability of operations. The reliance on traditional authentication methods, such as personal identification numbers (PINs) and passwords, or tangible items like smart cards and card keys, underscores the inherent vulnerabilities present in conventional approaches. The susceptibility to security breaches, whether arising from compromised information or lapses in memory, accentuates the urgent need for a more secure and dependable solution in the face of the ever-evolving landscape of cyber threats.

In stark contrast to the limitations posed by traditional methods, biometric systems stand out as a groundbreaking stride in authentication technology, offering a profound paradigm shift in terms of reliability, security, and user convenience. What distinguishes these systems is their remarkable ability to identify not just static characteristics but unique features and behavioral patterns intrinsic to each individual. This departure from convention aligns seamlessly with a broader trend in safety research, where the exploration of bio-signals for personnel identification and certification is gaining increasing momentum.

The spectrum of bio-signals spans a rich array, including fingerprints, lip movements, facial features, iris patterns, speech, retina scans, Electrocardiogram (ECG), Electromyography (EMG), Electroencephalography (EEG), and Photoplethysmography (PPG). This diverse range of bio-signals is gaining recognition for its inherent uniqueness and wide applicability in

human identification. The multifaceted characteristics of these bio-signals position biometric-based applications as a promising avenue, ushering in an infallible and optimistic future for secure authentication protocols.

The evident surge in the adoption of biometric personal identification systems across high-security environments, such as airports, banks, military sites, and restricted areas, underscores their growing indispensability in safeguarding databases, information, and overall safety. Beyond specialized environments, their seamless integration into everyday information technology (IT) devices like computers and smartphones further emphasizes their pervasive relevance. However, it is noteworthy that prevailing studies predominantly concentrate on features derived from face, DNA, iris, and fingerprint recognition (Azam and Sidek 2016, 1-6; Singhal, Gupta, and Garg 2012, 6-10). Research findings reveal potential susceptibilities in some static biometric data, such as iris and fingerprint recognition, to duplication. Moreover, challenges arise in differentiating between twins with facial and Deoxyribonucleic acid (DNA) recognition.

In response to these challenges, the introduction of dynamic biometric identification, exemplified by photoplethysmography signals (PPG), emerges as a strategic move to fortify the reliability and security of existing identification systems. The inherent random and time-variance characteristics of bio-signals contribute significantly to their uniqueness, ease of obtainment, and resistance to duplication. This positions dynamic biometric identification, particularly PPG signals, as a pivotal advancement in the pursuit of a more robust, trustworthy, and adaptive authentication framework tailored to the evolving needs of modern automation. The incorporation of dynamic signals, such as PPG, represents a sophisticated approach, enhancing the resilience and adaptability of authentication systems in the face of ever-evolving security challenges.

1.2 A Comparative Analysis of Biometric and Conventional Identification Methods

Biometric and conventional identification methods are two different ways of proving who we are. Biometric methods use our physical features, like our fingerprint or face, while conventional methods use things like passwords or ID cards. Each method has its own special qualities that we need to think about carefully.

Biometric identification systems use special things about our bodies or how we act to figure out who we are. For example, they can look at our fingerprints, scan our eyes, recognize our faces, or listen to our voices. The great thing about biometrics is that it is really accurate because these

things are different for each person. But some people worry that our personal information might not be safe, so we have to make sure it is protected and only used the right way.

Biometrics is a way to keep things safe by using unique traits, like fingerprints or faces, to identify people. It is hard for bad people to fake these traits, but sometimes they can try. We have special technology that can detect if someone is trying to fake it. Using biometrics is also really easy for us because we do not have to remember complicated passwords or carry special things with us. Even though it can be expensive at first, it helps us save time and stay safe in the long run. That is why more and more places are starting to use biometrics.

Conventional ways to prove who you are usually involve things like passwords or ID cards. But these methods have some problems. Passwords can be stolen or guessed, and ID cards can be lost. It can also be hard to remember all your passwords and update them regularly, which can make things inconvenient and not very safe.

Conventional methods can be used in many different ways and can work together with other things we already have. They are often used to make sure only the right people can get into certain places, use certain accounts, or prove who they are. But because they rely on things that other people might find out or steal, bad people could take advantage of those weaknesses.

In simple terms, using both biometric (like fingerprints or face recognition) and regular identification methods together makes it harder for bad people to pretend to be someone else. This way, we can make sure it is really you when you want to access something important. It is like having two different locks on a door to keep it extra safe. The best method to use depends on the situation and how important it is to keep things secure.

1.3 Problem Statements

In the labyrinth of biometric identification, the quest for the most reliable and expedient method unfolds against the backdrop of diverse challenges inherent in each unique characteristic. DNA sequencing, heralded for its unrivaled accuracy, stands as the apex predator of biometrics, yet its prowess is tempered by the shackles of time — a prolonged authentication process, a protracted 90-minute cadence, rendering it impractical for the swift dance of real-time authentication (Ko, Sassoubre, and Zola 2018, 1-6). The labyrinth deepens as the integration of DNA into the realm of authorization unveils additional hurdles, casting shadows over its seamless application.

Likewise, the vulnerabilities woven into the fabric of other biometric features, such as the susceptibility of fingerprints to replication through latex and the potential mimicry of sound, underscore the exigency for fortified security measures. The intricate landscapes of Electroencephalogram (EEG) and Electrocardiogram (ECG), adorned with their elaborate electrode setups, contribute to their impracticality in the swift orchestration of real-time identification. Amidst these intricacies, Photoplethysmography (PPG), wielding the simplicity of a fingertip-based sensor, emerges as a pragmatic savior. PPG signals, effortlessly obtainable, pave the way for prolonged collection without the labyrinthine complexities that shroud its biometric counterparts. Despite ECG's undisputed supremacy in accuracy, its demands for intimate proximity to the heart, coupled with portability and cost constraints, relegate it to the shadows in the face of the more versatile and accessible PPG.

As we delve into the nuanced tapestry of biometric identification, it becomes imperative to acknowledge the vulnerabilities that lurk within certain types of biometric data — vulnerabilities that manifest as echoes of duplication, hacking, and elevated false non-matching rates. Within this dynamic arena, the Photoplethysmography signal (PPG) emerges as a beacon of promise, its untapped potential extending far beyond its traditional role in heart rate monitoring and medical contexts. The real-time processing systems beckon for an extensive exploration of PPG signals in the realm of personal identification, driven by their inherent uniqueness for each individual and the tantalizing prospect of elevating the overall security landscape.

In this narrative, PPG assumes the mantle of a pragmatic sentinel, offering not only a versatile solution to the challenges that beleaguer other biometric modalities but also a promising avenue for innovative research and advancements within the dynamic landscape of personal identification systems.

1.4 Aims and Objectives

This book embarks on a groundbreaking journey, spearheading the conceptualization, development, and real-world implementation of an avant-garde biometric personal identification security system. Rooted in the bedrock of photoplethysmography signals, this endeavor aspires not only to elevate the security landscape but also to carve a path toward practical applications that resonate with the dynamic demands of our interconnected world.

- (i) **System Development Odyssey:** Embark on a riveting exploration into the intricate construction of a robust system, meticulously designed for the collection and profound analysis of Photoplethysmography (PPG) signals. Unravel the intricacies woven into this unique biometric data, dissecting its nuances to lay the foundation for a groundbreaking security paradigm.
- (ii) **Feasibility Unveiled:** Witness the practical manifestation of innovation as the developed system seamlessly integrates into a tangible biometric security device. Demonstrating its viability, this device emerges as a testament to the efficacy of authenticating individuals based on their distinctive PPG signatures, heralding a new era in personalized security.
- (iii) **Affordability and Portability Symphony:** Engineer a symphony of affordability, user-friendliness, and portability, sculpting a security device that transcends barriers and ensures accessibility for a diverse user base. This chapter in our journey is dedicated to crafting a device that seamlessly integrates into daily life, making security an unobtrusive companion.
- (iv) **Supervised Learning Ballet:** Explore the intricate dance of supervised learning models, where PPG signals take center stage as the foundational element for constructing a robust personal recognition framework. In this realm, the synergy between biometrics and security unfolds, promising a sophisticated dance of accuracy and reliability.
- (v) **Measurement Enhancement Symphony:** Delve into the realm of advanced measurement techniques, orchestrating a symphony of enhancements to elevate the accuracy rates of acquired PPG data. Fine-tune the system for optimal performance, ensuring its prowess in diverse real-world scenarios.
- (vi) **Integration into Security Constellations:** Cast your gaze beyond the horizon as we explore the practical implementation of PPG signals in broader security systems. Illuminate their role in fortifying and advancing the overall security infrastructure, weaving them seamlessly into the fabric of modern security constellations.

This comprehensive odyssey navigates the intricate world of biometric security, offering not just insights but methodologies and practical applications that promise to reshape the landscape of personal identification systems. Through meticulous examination, readers will gain a profound understanding of the challenges, opportunities, and transformative

potential inherent in the fusion of biometrics and security technologies. Welcome to the future – where biometrics and security converge in a symphony of innovation and practicality.

1.5 Overview of the Book

This book unveils biometric identification as a pivotal strategy for bolstering security measures, capitalizing on unique bio signals distinguished by subject-specific patterns challenging to replicate and contingent on the user's physical presence. A groundbreaking approach is introduced, centering on the utilization of photoplethysmographic (PPG) signals known for their easy accessibility and cost-effectiveness. The method proposed involves extracting PPG signals via an optical sensor, exploring the viability of PPG signals as an inherently distinctive biometric trait.

The detailed research within this book encompasses biometric datasets derived from the fingertips of 40 healthy subjects, demonstrating the efficacy of PPG signals as robust bio-measures for identification, particularly under controlled conditions with high-precision sensors. The comprehensive analysis presented involves extracting over ten thousand feature sets, with a randomly selected 30% subset utilized for identifications. Notably, the Support Vector Machine (SVM) model surpasses the Multilayer Perceptron (MLP) model, achieving an outstanding accuracy rate of 99.46%, a substantial improvement compared to the approximately 98.11% accuracy attained by the latter. Setting the accuracy threshold at 75% proves successful in accurately identifying all participants.

The book delves into the development of a biometric personal identification system grounded in PPG signals, aiming to enhance security in critical sectors such as banking, military, and information technology. This initiative arises from recognizing the inherent limitations associated with password-based security in the current landscape of advanced information technology, addressing concerns regarding password vulnerabilities.

The selected PPG signal, as detailed in this book, is unique to each individual and obtainable as long as the person is alive, ensuring the universal applicability of the system. This innovative approach not only heightens security but also addresses the intricate challenge of identifying twins with identical faces and DNA, emphasizing the formidable difficulty in forging PPG signals. Despite its reliance on a relatively low-cost, straightforward circuit, the system guarantees high accuracy and reliability in personal identification.

As discussed in this book, the user-friendly design of the system requires no specialized IT knowledge or technical skills, ensuring accessibility for individuals across diverse age groups. Furthermore, the book details the affordability of the system, amplifying its potential for widespread implementation in the fabric of human daily life, promising a paradigm shift in the realm of secure and accessible personal identification systems. This pioneering research, comprehensively detailed in the book, signifies a significant step towards advancing biometric technology, providing a robust and user-friendly solution for secure personal identification across various sectors.

CHAPTER 2

BIOMETRICS

KIM HO YEAP, CHEE THENG CHOW,
HUI TYEN LOW, HUMAIRA NISAR

2.1 Introduction

Biometrics, the metrics tied to the physical characteristics of the human body, are a cornerstone in the realm of personal identification, with diverse and unique features such as fingerprints, brain activity, vein patterns, and walking style distinguishing each individual. Even among identical twins, the fingerprints remain distinct, emphasizing the exceptional nature of these characteristics (Ko, Sassoubre, and Zola 2018, 1-6). Numerous technologies exist for measuring biometrics and deploying them for authentication, ranging from surface-based measurements, like faces and fingerprints, to invisible biometrics relying on biological processes, such as voiceprint technology based on the unique combination of human throat, lungs, and vocal organs, or measuring ECG and PPG signals through the user's wrist (Azam and Sidek 2016, 1-6).

A biometric system operates as a pattern identification technique, recognizing individuals based on feature vectors derived from their unique physiological or behavioral characteristics. The system must achieve acceptable accuracy, have reasonable resource requirements, and ensure the safety of the subject. Due to the uniqueness of biometric identifiers, individuals must physically present themselves at the recognition point, adding an extra layer of security compared to easily reversible approaches like passwords and PINs. This shift towards biometric methods of identification is primarily driven by their heightened reliability in verifying identity (Ko, Sassoubre, and Zola 2018, 1-6).

Biometrics, the study of measurable biological characteristics for identity verification, is categorized into two types: behavioral biometrics and physical biometrics. Behavioral biometrics, requiring time for

measurement, include keystroke dynamics, signature analysis, and voice recognition. On the other hand, physical biometrics measure intrinsic physical characteristics like facial features, iris patterns, and finger images. The application of most biometric systems in security underscores their permanence, collectability, universality, distinctiveness, and robustness, making them a secure and trusted means of personal identification and authentication.

During personal identification and authentication processes, all types of biometrics undergo a standardized series of steps involving data capturing, processing, and matching. Measurements are initially taken using sensors, and the data is digitally captured and transferred for signal processing. In this phase, raw biometric data undergoes matching, extracting relevant features to create a biometric template. The segmentation method is utilized to separate relevant features from background information, creating a quality score that is then compared with reference templates using a matching algorithm. The decision-making process yields positive or negative match results based on meeting quality and match score criteria (Azam and Sidek 2016, 1-6).

Research by Singhal, Gupta, and Garg (2012, 6-10) and Azam and Sidek (2016, 1-6) indicates a gradual transition from traditional personal identification systems to biometric personal identification systems. A comprehensive overview of the advantages and disadvantages of biometric personal identification systems is provided in Table 2.1.

While photoplethysmography (PPG) signals are less commonly utilized in real-life applications, they represent a unique biometric data type. Azam and Sidek (2016, 1-6) suggest that PPG signals offer higher accuracy and reliability due to their temporal stability, resistance to spoofing, low false acceptance rates, ease of use, and cost-effectiveness. Notably, PPG-based biometric identification systems show promise in identifying identical twins (Nadzri et al. 2016, 36).

2.2 Ideal Uses of Biometric Technology

The concept of biometrics has been an integral part of human society since the beginning of time, starting from the moment of birth and extending its influence through the subtle nuances of voice modulation and the unique features of the human face. Although the roots of biometric practices can be traced back to ancient civilizations, the contemporary era has witnessed the emergence of automated biometric systems, which have transformed the landscape of technology.

Facial recognition, which is one of the earliest forms of biometric identification, has played a crucial role in human history by enabling individuals to distinguish between familiar faces and strangers. However, as societies have become more complex and global interactions have become more intricate, the task of facial recognition has become increasingly challenging, particularly in diverse and unfamiliar settings.

Despite these challenges, the modern landscape of biometric technology has successfully navigated and overcome these obstacles by deploying cutting-edge solutions on a global scale. Its applications are diverse, ranging from security and access control to financial transactions and healthcare. By analyzing specific physiological and physical characteristics, biometric systems can uniquely identify individuals, providing a robust layer of protection. Furthermore, biometrics has seamlessly integrated itself into various domains, revolutionizing the landscape of patient health records and other areas.

Biometric authentication has emerged as a crucial element in the realm of cybersecurity, providing an elevated level of security for online accounts, personal computers, phones, and tablets. This groundbreaking approach eliminates the need for individuals to grapple with the complexities of memorizing intricate passwords or carrying physical access cards. Forward-thinking companies have embraced biometric technology, incorporating it into their recognition systems to fortify access protocols and ensure that only authorized personnel are granted entry. The outcomes of biometric identification are truly remarkable, as they provide a secure gateway to sensitive information. Technologies such as fingerprint identification, along with retinal and iris scans, generate unique datasets that enable precise and foolproof identification of individuals.

In essence, the rise of biometrics in our contemporary landscape goes beyond mere technological innovation; it represents a paradigm shift in how we approach security, access, and identification. From infancy to various aspects of our daily lives, biometrics has seamlessly integrated itself, offering not only enhanced security but also a more efficient and personalized approach to authentication in our interconnected world.

2.2.1 Types of Biometrics

Biometrics, an innovative field that combines human interaction and technological progress, can be broadly classified into two main types: physical and behavioral biometrics. Physical biometrics focuses on the tangible and inherent characteristics of an individual's body, providing a wide range of unique identifiers. For example, fingerprint patterns are

extensively used in biometric identification, analyzing specific points to ensure accurate recognition. Facial characteristics employ advanced algorithms to examine facial contours and distinctive markers for authentication. Hand geometry, iris scans, retinal scans, and vein patterns further contribute to the array of physical biometrics, utilizing specific anatomical attributes for precise identification.

On the other hand, behavioral biometrics concentrates on the distinct patterns exhibited in an individual's behavior. Signature recognition, for instance, analyzes dynamic aspects such as stroke speed and pressure to identify a person's unique signature. Voice recognition, another aspect of behavioral biometrics, identifies individual vocal characteristics like pitch and cadence. Together, these behavioral traits provide an additional layer of identity verification.

The evolution of biometrics from its foundational role in human interaction to its current technological applications highlights its transformative impact on security, access control, and personal identification. Physical biometrics establishes a strong connection between the human body and advanced authentication technologies, ensuring unparalleled accuracy. Conversely, behavioral biometrics adds an adaptive layer to identification methods, recognizing the uniqueness in how individuals interact with systems and devices. This seamless integration of traditional practices with cutting-edge technologies showcases the versatility and adaptability of biometrics, reshaping the landscape of secure and efficient personal identification in our digital era.

2.2.2 Applications of Biometrics

Biometrics, an ever-evolving field that combines technology and security, encompasses a wide range of unique physiological and behavioral characteristics. Fingerprint recognition, among the various physiological biometrics, is widely recognized for its reliability and is extensively used in law enforcement, access control, and unlocking modern mobile devices. The intricate patterns on a person's fingertip are not only difficult to replicate but also highly accepted due to their well-established technology and exceptional accuracy.

Iris recognition, another physiological biometric, focuses on the distinct patterns of the iris, the colored part of the eye. This technology has found its niche in access control systems, border security, and airport check-ins. Its non-intrusive nature and remarkable accuracy make it an ideal choice in situations where precision and security are of utmost importance. Similarly, retina scans, which analyze the patterns of blood

vessels at the back of the eye, are commonly used in high-security environments like military facilities and government installations, providing a level of uniqueness that is highly resistant to forgery.

Facial recognition, a versatile and widely implemented biometric, relies on the unique features of a person's face for identification. Its applications range from airport security and surveillance to the everyday unlocking of smartphones. The appeal of facial recognition lies in its non-intrusive nature and real-time capabilities, making it a preferred solution in various contexts. Hand geometry, a simpler yet effective physiological biometric, is often utilized in access control systems for industries and offices. Its advantage lies in its simplicity and non-intrusive nature, making it accessible in diverse settings.

Palm print recognition, similar to fingerprint recognition, focuses on the distinct patterns found on the palm. This biometric technique is useful in access control and forensic applications. The advantage of palm print recognition lies in the uniqueness of the patterns, along with its widespread acceptance in different security scenarios. DNA matching, known for its high accuracy in biometrics, is applied in forensics, criminal investigations, and paternity testing. The long-term stability and uniqueness of DNA patterns contribute to the unmatched precision of this biometric method.

Moving on to behavioral biometrics, signature recognition plays a significant role in secure transactions, banking, and verification of legal documents. The continuous verification process, made possible by the natural act of signing, makes it a practical and user-friendly solution. Keystroke dynamics, another behavioral biometric, involves analyzing the typing patterns of individuals for computer login authentication. This non-intrusive method provides continuous verification and user-friendly interaction.

Voice recognition, a well-established behavioral biometric, has found applications in phone authentication and voice-activated systems. Its non-intrusive nature, combined with its natural usage, has contributed to its widespread acceptance. Gait analysis, which examines an individual's walking patterns, serves security and surveillance purposes. Non-intrusive and offering continuous verification, gait analysis provides an additional layer of security in various settings. Typing patterns, a subtle behavioral biometric, are often used in computer login and online security. The continuous verification and user-friendly nature of this method make it a practical choice in different digital environments.

Exploring the realm of emerging biometrics, heartbeat biometrics involve the monitoring of an individual's unique heartbeat pattern. This

technology is utilized in wearable devices and secure access control systems, offering the advantage of being highly difficult to replicate and providing continuous monitoring. Vein pattern recognition, on the other hand, focuses on the distinct patterns of veins and is applied in access control and secure transactions. The internal nature of vein patterns enhances security by making forgery challenging.

Innovative biometric method, ear shape recognition, is being investigated for its potential applications in forensic investigations and secure access. The ear's unique patterns add an extra layer of security, and its non-intrusive nature makes it particularly appealing. These emerging biometrics highlight the ongoing evolution of the field, introducing new methods that enhance both security and accessibility.

The financial sector has widely adopted biometrics for secure financial transactions, ATM transactions, and fraud prevention. In healthcare, biometrics are utilized for patient identification and secure access to medical records, ensuring accurate and confidential healthcare delivery. Government and law enforcement agencies rely on the precision and uniqueness of biometric identifiers for border control, criminal investigations, and national security. Information technology integrates biometrics for network security, secure logins, and data protection, safeguarding digital assets. The travel and transportation industry streamlines processes and enhances overall security by utilizing biometrics for airport security and secure access to transportation systems. Biometrics also play a crucial role in education, ensuring secure access to educational facilities and exam centers, contributing to a safe and efficient learning environment. In the realm of smartphones and consumer electronics, biometrics offer a seamless and secure user experience by facilitating device unlocking, mobile payments, and app security. Additionally, workplaces promote efficiency and security in organizational settings by deploying biometrics for access control in offices and time and attendance tracking.

In conclusion, biometrics encompass a diverse landscape of physiological and behavioral characteristics tailored to specific applications across various industries. The continuous evolution of biometric technology underscores its pivotal role in enhancing security, convenience, and efficiency in the modern era.

2.2.3 Challenges of Biometrics

The use of biometric technology presents numerous advantages in verifying identity, but it also poses a variety of challenges that extend across technical, ethical, and societal dimensions. One of the most

significant challenges is the potential threat to privacy and security. The storage of sensitive biometric data, such as fingerprints, iris scans, or facial recognition patterns, raises concerns about unauthorized access, hacking, or data breaches. The compromise of such personal information could result in identity theft or other malicious activities, posing a significant risk to individuals' privacy.

Another critical challenge is the inherent risk of biometric systems producing false positives or false negatives. These errors can arise from variations in data quality, changes in an individual's biometric characteristics over time, or environmental factors. Such inaccuracies can undermine the reliability of biometric systems, impacting their effectiveness in providing secure identification and authentication.

Cultural and social acceptance is also a significant hurdle. People may have reservations about sharing their biometric information due to privacy concerns, cultural beliefs, or worries about potential misuse. Overcoming these psychological barriers and building public trust in biometric technology requires transparent communication, education, and the establishment of clear ethical guidelines.

The permanence of biometric markers presents a distinct challenge. Unlike passwords or PINs, which can be changed if compromised, biometric data remains constant throughout a person's lifetime. If there is a data breach, the compromised biometric information cannot be easily replaced, raising concerns about long-term security implications and the potential for identity theft.

The deployment of biometric systems faces technical challenges due to interoperability and standardization. Different devices and applications may use different algorithms or formats for biometric data, making it difficult to seamlessly integrate and creating compatibility issues. Standardizing biometric technologies across various platforms and ensuring interoperability is crucial for their widespread adoption and effectiveness.

The ethical use of biometric technology is a growing concern. As these systems become more prevalent, issues related to consent, user awareness, and responsible handling of biometric data come to the forefront. It is essential to establish clear ethical guidelines and regulatory frameworks to address these concerns and prevent the misuse of biometric information.

Moreover, the potential for mission creep, where biometric data collected for one purpose is used for unrelated applications without individuals' knowledge or consent, raises significant ethical questions. Striking the right balance between the convenience and security offered by biometric technology and protecting individuals' rights and privacy

requires careful consideration and ongoing dialogue between technology developers, policymakers, and the public.

To summarize, a comprehensive strategy is necessary to tackle the obstacles encountered by biometric technology. This strategy should encompass technical advancements, ethical deliberations, and public consciousness. It is crucial to prioritize stringent data protection measures, open and clear communication, and adherence to ethical guidelines in order to guarantee the responsible and secure implementation of biometric systems in various settings.

2.2.4 Pros and Cons of Biometrics

Biometric technology is an innovative aspect of modern identification and authentication systems, offering a range of advantages. One of its key benefits lies in its unmatched precision and dependability. Biometric markers, such as fingerprints, iris patterns, or facial features, are unique to individuals, providing a strong and secure method of verifying identity. This accuracy is particularly advantageous in high-security settings, such as controlling access to sensitive facilities or conducting secure financial transactions. Moreover, biometric technology improves convenience by eliminating the need for traditional authentication methods like passwords or PINs. Users only need to present their biometric data, simplifying the authentication process and reducing the chances of unauthorized access due to forgotten or compromised credentials. Additionally, biometrics provide a non-intrusive and user-friendly experience, which has led to their widespread adoption in various applications, including smartphones, border control, and time attendance systems.

However, the incorporation of biometric technology presents its own set of obstacles and issues. One significant drawback is the potential jeopardy to privacy and security. Storing sensitive biometric data raises concerns regarding unauthorized access or hacking, which could potentially result in identity theft. Biometric systems are not impervious to errors, and there is a possibility of false positives or negatives occurring, which can impact the reliability of the system. Cultural and social acceptance can also pose challenges, as individuals may have reservations about sharing their biometric information due to concerns about privacy or cultural beliefs. Furthermore, there are worries about the permanence of biometric markers and the consequences of data breaches, as compromised biometric information cannot be easily altered or replaced. Achieving a balance between the undeniable advantages and the ethical and security challenges of biometric technology necessitates continuous research,

stringent regulations, and transparent deployment practices to ensure responsible and secure integration into various aspects of our everyday lives.

2.3 Photoplethysmography (PPG)

Photoplethysmography (PPG) is a non-invasive electro-optical technique crucial for assessing blood volume dynamics in the microvascular tissue bed. The method entails placing a sensor on the fingertip, employing reflection and transmission sensors to capture PPG signals by detecting variations in light intensity across the tissue. A comprehensive setup involves positioning a light source on one side of the finger and a photodetector on the opposite side, generating a series of PPG signals, as depicted in Figure 2.1.

A standard PPG signal comprises both DC and AC components. The DC signals are directly derived from the veins, while the AC signals undergo absorption and reflection through muscle, skin, and bone before reaching the blood vessel veins. The DC part of the PPG waveform relies on tissue development and the normal blood volume of both blood vessel and venous blood. Conversely, the AC part records blood volume adjustments during the systolic and diastolic periods of the cardiovascular cycle. The resulting photoplethysmographic signal encompasses the alternating current (AC) and direct current (DC) components, as illustrated in Figure 2.2.

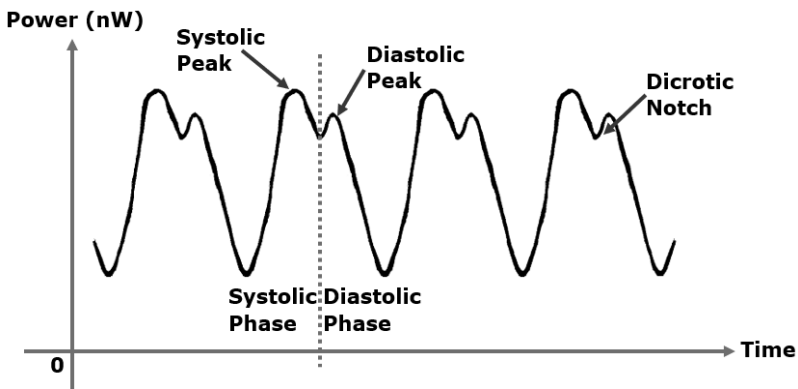


Figure 2.1. A standard photoplethysmography waveform