

some solution, but this is still unsure. The desired code length also remains evasive, and this comes to affect the necessity for error-correction codes. The fact that false rejection rates are lower bounded by error-correction capacities emerges as a great challenge since each change can make the system more vulnerable. The representation of the feature can bring better results but it may necessitate extended efforts in the direction of combination of many different templates using the fuzzy vault schemes methodology. Finally, from a biometric template protection perspective, the length of the keys remains a major topic for discussion. In conclusion, experiments that have been carried out in different studies with use of multiple combinations of biometric samples from the same identity and implemented in several template protection technologies, illustrate significant improvements with regards to reliability of the relevant applications. Different proposals of frameworks for the design of cryptosystems or cancelable biometrics that contain many modalities, have been presented enriching this research field. In spite of the encouraging results, several other issues might occur and demand further investigation [23]. Current literature studies are focused on the possibility to establish a generic model, which will cover the necessity for irreversibility and unlink ability, and secure enough to be used in many applications. The next section is dedicated to the emerging issues, from biometrics recognition to the protection categories, as those were presented above.

6. Conclusions and Discussion

In this work, we have presented a concrete approach on the protection of multimodal biometric templates, underlying critical privacy issues, while focusing on the suggestions for future research. Multimodal biometric systems are mostly discussed for the impact of their use on publicly accepted, reliable identification systems [31,53], overcoming the obstacles of uni-modal ones. Researchers propose different methods for combination of biometric traits, testing the possibilities that can induce to an effective fusion scheme for highly accurate recognition systems. During this study, there is an analysis of the three main fusion levels, in terms of theoretical [37] and recently published experimental knowledge [6,43]. The limitations of the single characteristic as a verification tool are revealed, while the vitality of multimodalities against fraudulent technologies is under examination. While biometric vendors are deploying multi biometric systems, at the same time concerns arise from the storage and misuse of the data [9]. The security of the templates is especially crucial for the confidentiality and integrity of this sensitive information. In the direction of facing a number of threats, works on the two main categories of biometric template protection schemes offer important advantages [19]. However, the significant number of studies on single biometric data [51] and the lack of security for multimodalities beyond their advantages, shift the organized and dedicated efforts to the connection of these areas. The incorporation of multiple biometrics in template protection schemes seems that can offer suggestions for solution against many drawbacks, while new security interrogations arise. During the last years, studies attempt to generate a compact generic framework and evaluate each proposed multimodal cryptosystem on large-

scale datasets. In this line, there are still many open research questions, and the merit of biometric cryptosystems should ideally be expanded. The nature and privacy properties of a system, that can be used in a generalized multimodal way, are highly counter-intuitive and deserve a deeper exposition and evaluation of the ways that could be significant to the problematic areas. Summarizing, the selection of the optimal fusion level and the choice for the appropriate modalities as well as their combination present special interest, because they are the basic challenges in the requirements of each system according to the application design. After all, biometrics is the new digital enabler in a fast advancing technological world and their greatest strength is their uniqueness, which is also one of their greatest weaknesses. And if biometric elements are compromised during the verification process, the identity of the user is the primary concern. And it is at this point where cryptographic issues for multi biometrics need to be further investigated.

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