Privacy-Preserving Genomics on a Large Scale

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In this talk, we present privacy-preserving solutions for Genome-Wide Association Studies (GWAS) based on Secure Multi-Party Computation (SMPC). Using SMPC, we protect the privacy of patients when medical institutes collaborate for computing statistics on genomic data in a distributed fashion. Previous solutions for this task lack efficiency and/or use inadequate algorithms that are of limited practical value. Concretely, we optimize and implement multiple algorithms for the χ^2 -, G-, and P-test in the ABY framework (Demmler, Schneider & Zohner (2015b), NDSS'15) and evaluate them in a distributed GWAS scenario. Statistical tests generally require advanced mathematical operations. For operations that cannot be calculated in integer arithmetic, we make use of the existing IEEE 754 floating point arithmetic implementation in ABY (Demmler, Dessouky, Koushanfar, Sadeghi, Schneider & Zeitouni (2015a), CCS'15). To improve performance, we extend the mixed-protocol capabilities of ABY by optimizing and implementing the integer to floating point conversion protocols of Aliasgari, Blanton, Zhang & Steele (2013) (NDSS'13), which may be of independent interest. Furthermore, we consider extended contingency tables for the χ^2 - and G-test that use codeword counts instead of counts for only two alleles, thereby allowing for advanced, realistic analyses. Finally, we consider an outsourcing scenario where two non-colluding semi-trusted third parties process secret-shared input data from multiple institutes. Our extensive evaluation shows, compared to the prior art of Constable, Tang, Wang, Jiang & Chapin (2015) (BMC Medical Informatics and Decision Making'15), an improved runtime efficiency of the χ^2 -test by up to factor 37×. We additionally demonstrate practicality in scenarios with millions of participants and hundreds of collaborating institutes. The results of this work were published by Tkachenko, Weinert, Schneider & Hamacher (2018) at ASIACCS'18.

References

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