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## Cryptographic Obfuscation

A Survey

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ISSN 2191-5768
ISSN 2191-5776 (electronic)
SpringerBriefs in Computer Science
ISBN 978-3-319-98040-9
ISBN 978-3-319-98041-6 (eBook)
https://doi.org/10.1007/978-3-319-98041-6
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This Springer imprint is published by the registered company Springer Nature Switzerland AG
The registered company address is: Gewerbestrasse 11, 6330 Cham, Switzerland

To our teachers

## Preface

"The Lord searches every heart and understands every desire and every thought."
1 Chronicles 28:9, NIV

The ambitious goal of cryptographic obfuscation is to hide the operation of computer programs. Being an applied science, problems considered by cryptography are rarely investigated from a philosophical point of view but in the case of obfuscation, probably it worth spending some time considering the consequences of achieving this goal. The possibility of securely obfuscating arbitrary functions could radically change the relationship between humans and computer programs. Namely, it would imply losing our insight into the programs which we have had, at least in principle, since the writing of the first program code. While this change still seems to be futuristic, recent cryptographic advancements made it more probable than ever before.

In 2013 the breakthrough result of Garg, Gentry, Halevi, Raykova, Sahai and Waters (FOCS 2013) changed the previously pessimistic attitude towards generalpurpose cryptographic obfuscation. Their finding was twofold. First, they managed to construct an obfuscator candidate that works for any function, which nonetheless was based on a rather idealistic assumption, and they showed a way to address the problem that had seemed impossible earlier. But what was probably even more important, they also demonstrated that their new tool is indeed useful and can help to solve other cryptographic problems as well. This latter observation was especially surprising as the security guarantee they achieved (called indistinguishability obfuscation) did not seem to have a practical relevance previously. An avalanche began and obfuscation became a central hub of cryptographic research. Cryptology ePrint Archive, the most active manuscript sharing forum of the community, counted over 190 related papers four years after the breakthrough, while before that fewer than 30 dealt with the topic. The potential realizability of such a powerful tool motivated a
plethora of applications, including solutions for long-standing open problems, from almost all areas of cryptography. At the same time, intense development of candidate constructions started with the double goal of basing the security of obfuscation on solid foundations and turning its incredible overhead into tolerable.

While these goals were still not achieved when finalizing our manuscript, the "obfuscation-fever" has already led us much closer to the root of hardness behind encrypted computations. However, looking up and understanding the key thoughts from an already huge number of articles that themselves are looking for the right definitions, methods, and formulations can be really troublesome and timeconsuming. This challenge, which we also had to face, motivated us to review the rapid development of candidate obfuscator constructions and organize the results of the first years since the breakthrough. As the field is still changing rapidly, our work is not intended to be a retrospection but rather a handrail for those who are fascinated by the incredible opportunities offered by obfuscation and would like to catch up with the latest results by understanding their background.

We hope that our survey can reflect the beauty of the field and the reader will find answers for many of his or her questions in it.

Budapest,
Máté Horváth
November 2018
Levente Buttyán

## Acknowledgements

First of all, we would like to thank our families for their patience. In this regard, special thanks goes to Judit. We are grateful to Ágnes Kiss, Örs Rebák and members of the CrySyS Lab for their efforts to help us improve this work. We appreciate the valuable questions and remarks of Ryo Nishimaki, Ran Canetti, Zvika Brakerski and unknown reviewers that either highlighted flaws in earlier versions of our manuscript or helped us to better understand certain problems. Finally, we would also like to acknowledge the support of the National Research, Development and Innovation Office - NKFIH of Hungary under grant contract no. 116675 (K).

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## Glossary

annihilating polynomial A polynomial $\rho$ is called the annihilating polynomial of a matrix $A$ if $\rho(A)=0$.
black-box technique When constructing (or separating, i.e. proving the impossibility of a reduction) one cryptographic primitive $\mathcal{P}$ from another one $\mathcal{Q}$, and we treat both $\mathcal{Q}$ and the adversary $\mathcal{A}$ as a black box (i.e. their code is not used), we say that the reduction from $\mathcal{P}$ to $\mathcal{Q}$ (or their separation) is black-box. Based on the extent of non-black-box techniques, several other notions of reducibility were defined by [RTV04] and refined by [BBF13].
branching program A branching program (BP) (a.k.a. binary decision diagram) is a DAG consisting of inner nodes of fan-out 2 labelled by Boolean variables $l_{i}$, including the source node (fan-in 0 ) and sinks of fan-out 0 , labelled 0 or 1 . The computation starts at the source and, at each node $l_{i}$, one proceeds to the other edge with label 0 if the $i$ th input bit $x_{i}=0$ or to the other if $x_{i}=1$. The BP computes $f$ if, for an input $x$, it reaches a sink, labelled by $f(x)$. A BP is layered if the nodes are partitioned into layers where the source is in the first layer and the sinks are in the last, and edges go only between nodes in consecutive layers. A permutation BP is a layered BP where all the nodes of a layer observe the same variable and the edges between any pair of consecutive layers form a permutation of the vertices (for any setting of the variables). See [Mit15, §5.8.1] and [Weg00].

| coAM | The complexity class coAM is the complement of AM, which is the set of decision problems which are decidable in polynomial-time by a so-called Arthur-Merlin protocol (a specific interactive proof system) with two messages. See [AKG17]. |
| :---: | :---: |
| CRS model | In the common reference string (CRS) model, it is assumed that everyone has access to a public string that is drawn from a predetermined distribution during a set-up phase. |
| factoring | The standard assumption of the hardness of factoring [Rab79] states that given $N=p_{1} \cdots p_{q}$, where all $p_{i}$ are random prime numbers of a given size, it is hard to find $K$ such that $\operatorname{gcd}(K, N) \notin\{1, N\}$. |
| knowledge assumption | "Knowledge or extractability assumptions capture our belief that certain computational tasks can be done efficiently only by going through certain specific intermediate stages and generating some specific kinds of intermediate values. /.../ Though these assumptions do not fall in the class of falsifiable assumptions [Nao03], these have been proven secure against generic algorithms, thus offering some evidence of validity." [GS14, §8 (full version)] |
| learning with errors | The search/decisional learning with errors (LWE) assumption of [Reg05] states that it is hard to recover/distinguish a secret random vector $x \in \mathbb{Z}_{p}^{n}$ given noisy linear equations on it, i.e. given $y \in \mathbb{Z}_{p}^{n}$ and random $A \in \mathbb{Z}_{p}^{n \times m}$ such that $y=A x+e \bmod p$, where $e$ is a random error vector of small magnitude. For its attractive features (e.g. suspected resistance to quantum attacks) and its connections to other assumptions, see [Pei16]. |
| $\mathrm{NC}^{0}$ | The class functions (also called local functions) which are computable by constant-depth, bounded-fan-in circuits, meaning that each output bit can only depend on a constant number of input bits. See [AKG17]. |
| NC ${ }^{1}$ | The class of polynomial-size circuits with logarithmic depth and bounded fan-in gates (more generally $\mathbf{N C}^{\mathbf{k}}$ denotes the class of polynomial-size circuits of bounded fan-in having depth $O\left(\log ^{k} n\right)$, where $n$ is the input length). See [AKG17]. |
| negligible function | $\operatorname{neg}(n)$ is called negligible if it grows more slowly than any polynomial, i.e. $\forall c \in \mathbb{N}, \exists n_{0} \in \mathbb{N}$ such that $\forall n \geq n_{0}$ : $\operatorname{neg}(n)<n^{-c}$. |


| NP | "NP is the class of decision problems solvable by a <br> non-deterministic polynomial-time TM such that if the <br> answer is 'yes,' at least one computation path accepts, |
| :--- | :--- |
| but if the answer is 'no,' all computation paths reject" |  |
| [AKG17]. |  |
| This is a public-key cryptosystem proposed by [HPS98] |  |
| that is a possible alternative to factorization and discrete- |  |
| log-based encryption schemes because of its efficiency |  |
| and the fact that it is not known to be vulnerable to quan- |  |
| tum attacks. [SS11] made it provably secure, assuming |  |
| the hardness of worst-case problems over ideal lattices. |  |
|  | The abbreviation refers to an Nth-degree truncated poly- |
|  | nomial ring, the underlying algebraic structure on which |
| the cryptosystem is built. |  |
| Informally speaking, a one-way function is a function |  |
| that is easy to evaluate but hard to invert (on average). |  |

$\left.\begin{array}{ll}\text { SNARG } & \begin{array}{l}\text { Succinct non-interactive arguments (SNARG) is a com- } \\ \text { putationally sound (i.e. it is computationally infeasible } \\ \text { to prove an assertion that is not true) proof system with } \\ \text { short proofs for an NP-language. See [DSB17]. }\end{array} \\ \text { SNARK } \\ \text { Succinct non-interactive argument of knowledge } \\ \text { (SNARK) is a SNARG system with the additional } \\ \text { property that the correctness of a SNARK proof } \\ \text { guarantees that the prover "knows" a witness to the } \\ \text { statement with overwhelming probability. For details, } \\ \text { see [BCC }{ }^{+} 17, \text { DSB17]. } \\ \text { standard model } & \begin{array}{l}\text { In the standard, or plain, model, we assume that the ad- } \\ \text { versary is limited only by the available amount of time }\end{array} \\ \text { TC }^{0} & \begin{array}{l}\text { and computational power. }\end{array} \\ \text { TC }{ }^{0} \subseteq \text { NC }^{1} \text { is the class of all Boolean circuits with } \\ \text { constant depth and polynomial size, containing only } \\ \text { unbounded-fan-in AND gates, OR gates, NOT gates, and }\end{array}\right\}$

## Acronyms

| AS | Ananth-Sahai assumption |
| :---: | :---: |
| BGKPS | ideal graded encoding scheme (GES) model proposed by [ $\mathrm{BGK}^{+}$14] (see Table 2.4) |
| BP | branching program |
| BPO | best-possible obfuscation |
| BR | ideal GES model proposed by [BR13] (see Table 2.4) |
| BSH | bounded speedup hypothesis |
| BSH ${ }^{\prime}$ | parametrized bounded speedup hypothesis |
| CCA | chosen ciphertext attack model |
| CDH | computational Diffie-Hellman problem |
| CLT13 | candidate GES type based on [CLT13] |
| CPA | chosen plaintext attack model |
| CRS | common reference string (see Glossary) |
| CRT | Chinese remainder theorem |
| d-MBP | dual-input matrix branching program (MBP) |
| DAG | directed acyclic graph |
| DDH | decisional Diffie-Hellman problem |
| DES | data encryption standard |
| DiO | differing-input obfuscation |
| Dlog | discrete logarithm problem |
| dRE | decomposable randomized encoding |
| EPI | equivalent program indistinguishability |
| ETH | exponential time hypothesis |
| $\left(P_{1}, P_{2}, P_{3}, P_{4}\right)$-FE | functional encryption with the properties defined in §2.2.2 |
| FE | functional encryption |
| FHE | fully homomorphic encryption |
| $\mathcal{F}_{\text {Lin }}$ | function class defined by [Lin16] (see §4.4.1) |
| gcd | greatest common divisor |
| GCMM | generic coloured matrix model of [ $\mathrm{GGH}^{+} 13 \mathrm{~b}$ ] |


| GES | graded encoding scheme |
| :---: | :---: |
| GGH13 | candidate GES type based on [GGH13a] |
| GGH15 | candidate GES type based on [GGH15] |
| GGHZ | the assumption proposed by [GGHZ16] |
| GGM | generic group model |
| gMBP | generalized MBP of [BMSZ16] |
| GMM+ | "weak" ideal GES model proposed by $\left[\mathrm{GMM}^{+} 16\right]$ (see Table 2.4) |
| IBE | identity-based encryption |
| iO | indistinguishability obfuscation |
| IPFE | inner-product functional encryption |
| jSXDH | joint SXDH |
| LWE | learning with errors (see the Glossary) |
| MBP | matrix branching program |
| MIFE | multi-input functional encryption |
| ML | machine learning |
| MMap | multilinear map |
| MPC | secure multi-party computation |
| MSE | multilinear subgroup elimination assumption |
| MSW-1 | "multiplication restricted" ideal GES model of [MSW15] (see Table 2.4) |
| MSW-2 | "non-restricted" ideal GES model of [MSW15] (see Table 2.4) |
| MSZ | "weak" ideal GES model proposed by [MSZ16] (see Table 2.4) |
| NIWI | non-interactive witness-indistinguishable proofs |
| NMiO | neighbouring-matrix iO |
| OWF | one-way function (see the Glossary) |
| PAFE | projective arithmetic functional encryption |
| pdRE | program-decomposable randomized encoding |
| PiO | probabilistic indistinguishability obfuscation (iO) |
| pk-FE | public-key functional encryption |
| PKE | public-key encryption |
| PPRF | puncturable pseudo-random function |
| PPT | probabilistic polynomial time |
| PRF | pseudo-random function |
| PRG | pseudo-random generator |
| PRG ${ }^{X=z}$ | polynomial-stretch pseudo-random generator (PRG) with complexity $z$ according to the complexity measure $X$ (see §2.2.5) |
| RAM | random access machine |
| RE | randomized encoding |
| rMBP | relaxed MBP of [AGIS14] |
| ROM | random oracle model (see the Glossary) |
| SD | subgroup decision assumption |


| SE | slotted encoding |
| :---: | :---: |
| SHE | somewhat homomorphic encryption |
| SiO | strong iO |
| sk-FE | secret-key functional encryption |
| SNARG | succinct non-interactive argument (see the Glossary) |
| SNARK | succinct non-interactive argument of knowledge (see the Glossary) |
| SSGES | semantic security of GESs |
| SSGES ${ }^{\prime}$ | sub-exponential semantic security of GESs |
| SXDH | symmetric external Diffie-Hellman assumption |
| SXiO | strong exponentially efficient iO ( XiO ) |
| SXiO' | strong XiO with compression factor only slightly smaller than 1 |
| TM | Turing machine (Glossary) |
| UC | universal circuit |
| VBB | virtual black-box |
| VGB | virtual grey-box |
| WBC | white-box cryptography |
| XiO | exponentially efficient iO |

