Provably Secure Camouflaging Strategy for IC Protection

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ICCAD2016 - November 07, 2016 - Austin, TX

Introduction ●0			
Introduc	rtion		

- IP protection against reverse engineering becomes a significant concern
- Reverse engineering flow







Introduction 00			
Introduct	tion		

- IC camouflaging is proposed to hide circuit functionality
 - Layout technique
 - Create cells that look alike but have different functionalities



- Open questions to solve:
 - How to evaluate the security of a camouflaged netlist
 - ► How to reduce the overhead introduced by IC camouflaging



- Fabrication level techniques:
 - ► Contact- and doping-based techniques [Chow+, US Patent'07]



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- Cell level designs:
 - Camouflaging lookup table [Malik+, ISVLSI'15]

Introduction State-of-The-Art Preliminary Complexity Analysis Experiments Conclusion of State-of-The-Art IC Camouflaging

- Fabrication level techniques:
 - ► Contact- and doping-based techniques [Chow+, US Patent'07]
- Cell level designs:
 - Camouflaging lookup table [Malik+, ISVLSI'15]
- Netlist level camouflaging cell insertion strategy:
 - ▶ Insertion based on interference graph [Rajendran+, CCS'13]

State-of-The-Art

State-of-The-Art IC Camouflaging

- Fabrication level techniques:
 - Contact- and doping-based techniques [Chow+, US Patent'07]
- Cell level designs:
 - Camouflaging lookup table [Malik+, ISVLSI'15]
- Netlist level camouflaging cell insertion strategy:
 - Insertion based on interference graph [Rajendran+, CCS'13]

Our contribution

- A provably secure criterion is proposed and formally analyzed from Machine Learning perspective
- Two factors that improve the circuit security are revealed
- A camouflaging framework is proposed to increase the security exponentially with linear increase of overhead



- Knowledge of the attacker:
 - Get camouflaged netlists
 - Include cells and connections
 - Differentiate regular and camouflaging cells
 - Don't know the specific functionality of camouflaging cells
 - Acquire a functional circuit as black box
 - Don't have access to internal signals



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- The attacker aims to recover the circuit functionality by querying the black-box functional circuit

		Preliminary ●0		
Prelimina	ary: Revers	e Enginee	ring Attack	

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 - Acquire a functional circuit as black box
 - Don't have access to internal signals
- The attacker aims to recover the circuit functionality by querying the black-box functional circuit
- Attacker query strategy:
 - Brute force attack
 - Testing-based attack [Rajendran+, CCS'13]
 - SAT-based attack [Massad+, NDSS'15]

Introduction State-of-The-Art Preliminary Complexity Analysis Experiments Conclusion of Preliminary: SAT-based Attack

- Key idea:
 - Only query black box with input patterns that can help remove false functionalities
 - No existing camouflaging strategy demonstrates enough resilience





• IC de-camouflaging can be modeled as a learning problem

- \blacktriangleright Functions of camouflaged circuit \leftrightarrow A set of boolean functions
- Original circuit \leftrightarrow Target boolean function
- ► Input-output pairs ↔ Samples
- Different attack methods correspond to different sampling strategies
 - Brute force attack \leftrightarrow Random sampling
 - \blacktriangleright SAT-based attack \leftrightarrow Query by disagreement
 - SAT-based attack requires asymptotically less number of input-output pairs compared with brute force attack

Introduction State-of-The-Art Preliminary Complexity Analysis Experiments Conclusion of Ococo Oc

- De-camouflaging complexity (DC)
 - Number of input patterns the attacker needs to query to resolve circuit functionality
 - Independent of how the de-camouflaging problem is formulated
- Then, de-camouflaging complexity is

$$\textit{DC} \sim \textit{O}(heta \textit{d} \log(rac{1}{\epsilon}))$$

- ► *d*: characterize the total number of functionalities
- θ: characterize the number of functionalities that can be pruned by each input pattern
- ϵ : output error probability for the resolved circuit
- Intrinsic trade-off between DC and output error probability
- Need to increase θ and d to enhance security

			Complexity Analysis		
Novel	Camouflaging	cell Ger	eration Strat	egy	

- Target at increasing *d* for better security
 - To increase d
 - Increase the number of functionalities of the camouflaging cells
 - Increase the number of cells inserted into the netlist



NAND/NOR/XOR





• Observation:

- Overhead of a cell depends on its functionality
- Cell design strategy:
 - Build cells with negligible overhead for certain functionality
- Two different types:
 - Dummy contact-based camouflaging cells
 - Stealth doping-based camouflaging cells



• Dummy contact-based camouflaging cells



	BUF		A	ND2	OR2	
Function	BUF	INV	AND2	NAND2	OR2	NOR2
Timing	1.0x	2.0x	1.0x	1.5x	1.0x	1.9x
Area	1.0x	1.5x	1.0x	1.3x	1.0x	1.3x
Power	1.0×	1.5x	1.0×	0.9×	1.0×	1.1x



• Stealth doping-based camouflaging cells



	AND2		OR2		NAND2	
Function	AND2	BUF	OR2	BUF	NAND2	INV
Timing	1.0x	1.4x	1.0x	1.4x	1.0x	1.6x
Area	1.0x	1.3x	1.0x	1.3x	1.0x	1.5x
Power	1.0x	1.2x	1.0x	1.2x	1.0x	1.5x



- Characteristics of two type camouflaging cells:
 - Dummy contact-based cell: error probability is 1
 - Stealth doping-based cell: enable dummy wire connection
- Contact and doping technique can be further combined to increase the number of functionalities



Introduction State-of-The-Art Preliminary Complexity Analysis Experiments Conclusion of AND-Tree Camouflaging Strategy

- Target at increasing θ for better security
- AND-Tree achieves high resilience against SAT-based attack
 - \blacktriangleright Represent a class of circuits with output 0/1 for only one input
- We find θ increases exponentially for ideal AND-Tree
 - Unbiased primary inputs: i.i.d binary distribution
 - Non-decomposability







Overall Camouflaging Framework

- Combine the proposed camouflaging strategy
 - Leverage camouflaging cells to insert AND-Tree



			Complexity Analysis	
AND-Tre	e Detection	า		

- Detect existing AND-Tree structure in the netlist
- Important criterion:
 - AND-Tree size
 - AND-Tree input bias (distance with ideal distribution)
 - AND-Tree de-composability



ANY ANY ANY ANY Node[Node] Node [Node:

			Complexity Analysis	
AND-Tre	e Detection	n		

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AND-Tre	e Detection		

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		Complexity Analysis	
AND-Tre	e Insertion		

- Insert AND-Tree when no trees exist in original netlist
 - Guarantee non-decomposable
 - Guarantee unbiasedness by connecting tree inputs to primary inputs
- To insert AND-Tree into the netlist



• θ increases exponentially as the inserted AND-Tree size

		Complexity Analysis 0000000000●	
AND-Tre	ee Insertion		

- Node selection criterion for AND-Tree insertion
 - Consider timing/Power overhead, error impact
- Define insertion score (IS) for each node

$$IS = \frac{\alpha \times SA - \beta \times P_{ob}}{N_O}$$

- ► SA: switching probability
- *P*_{ob}: observe probability
- ► N_O: number of outputs in the fanout cone
- Select nodes iteratively until AND-Tree exists in the fanin cone of each output

			Experiments ●0000	
Experim	ental Result	ts		

• Experimental setup

- ▶ SAT-based de-camouflaging attack [Subramanyan+, HOST'15]
- Runtime limit $1.5 \times 10^5 s$
- Camouflaging framework implemented in C++
- Timing/Power analysis with Primetime/Primetime-PX
- Benchmark: ISCAS'85 and MCNC

			Experiments 0●000	
Experime	ntal Results	;		

- Examination of cell generation strategy
 - Use the proposed camouflaging cells to rebuild the benchmarks

ben	ich	# input	# output	# gate	time (s)	# iter
	c432	36	7	203	1.758	80
	c880	60	23	466	$1.2 imes10^4$	148
ISCAS	c1908	33	25	938	N/A	N/A
IJCAJ	c2670	233	64	1490	N/A	N/A
	c3540	50	22	1741	N/A	N/A
	c5315	178	123	2608	N/A	N/A
MCNC	i4	192	6	536	$1.9 imes10^3$	743
	apex2	39	3	652	N/A	N/A
	ex5	8	63	1126	$6.9 imes10^2$	139
	i9	88	63	1186	$2.1 imes10^4$	81
	i7	199	67	1581	$1.5 imes10^2$	225
	k2	46	45	1906	N/A	N/A

			Experiments 00●00	
Experim	ental Result	ts		

• Examination of AND-Tree structure

- Ideal AND-Tree
- Impact of decomposability and input bias



			Experiments 000●0	
Experim	ental Result	ts		

- De-camouflaging complexity of the proposed framework
 - Combined strategy v.s. AND-Tree strategy



			Experiments 0000●	
Experim	ental Result	s		

• Overhead of the proposed framework



bench	# gate	area (%)	power (%)	timing (%)
c432	203	16.7	14.1	0.30
c499	275	5.83	4.32	0.00
c880	466	9.85	10.8	0.06
i4	536	12.0	8.73	0.00
i7	1581	5.41	4.02	0.15
ex5	1126	4.15	3.73	0.11
ex1010	5086	0.75	1.06	0.00
des	6974	0.64	0.23	0.00
sparc_exu	27368	0.22	0.05	0.00

			Conclusion ●0
Conclus	ion		

- The security criterion is formally analyzed based on the equivalence to active learning
- Two camouflaging techniques are proposed to enhance the security of circuit netlist
- A provably secure camouflaging framework is developed to combine two techniques
- Effectiveness of the framework is verified with experiments and demonstrate good resilience achieved with small overhead

		Conclusion OO

Thanks for your attention!



- Comparison with two different cell generation strategies
- Assume
 - Circuit size: N
 - Number of functions of each camouflaging cells
 - Previous method: *m*₁
 - Our method: m₂
 - Number of modified cells: n
- Number of possible functionalities
 - Previous method: $\sim m_1^n$
 - Our method: $\sim C_N^n m_2^n$
- If $N = 1000, m_1 = 8, m_2 = 2, n = 10$, then
 - Previous method: $\sim 10^9$
 - Our method: $\sim 10^{26}$

 Introduction
 State-of-The-Art
 Preliminary
 Complexity Analysis
 Experiments
 Conclusion

 Back Up:
 AND-Tree
 Camouflaging

• To camouflage the inserted AND-Tree

- Functional camouflaging with BUF/INV cell
- Structural camouflaging to hinder removal attack

