



Understanding and Characterizing the Cybercriminal Ecosystem Enabling Attack Innovation at Scale

Michele Campobasso

Security Group, Mathematics and Computer Science

Underground forums as criminal marketplaces

The Guardian News | Opinion | Sport | Culture | Life

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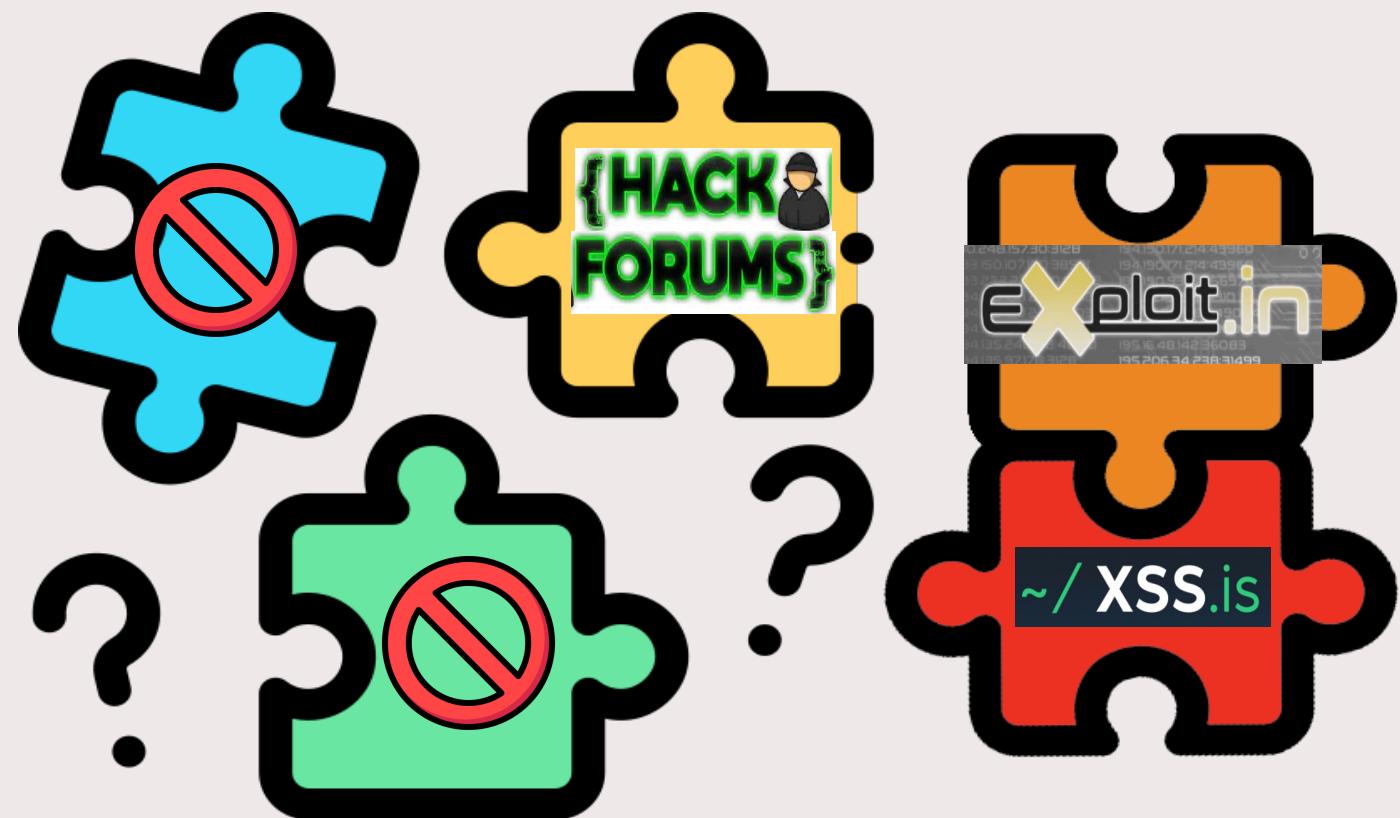
Money ▶ Property Pensions Savings Bo

Scams

Amount of fraud in U. than doubled to £2.3b Ransomware attack hits dozens of Romanian hospitals

BLEEPING COMPUTER

New cybercrime market 'OLVX' gains popularity among hackers



A large, fragmented ecosystem,
hard to navigate

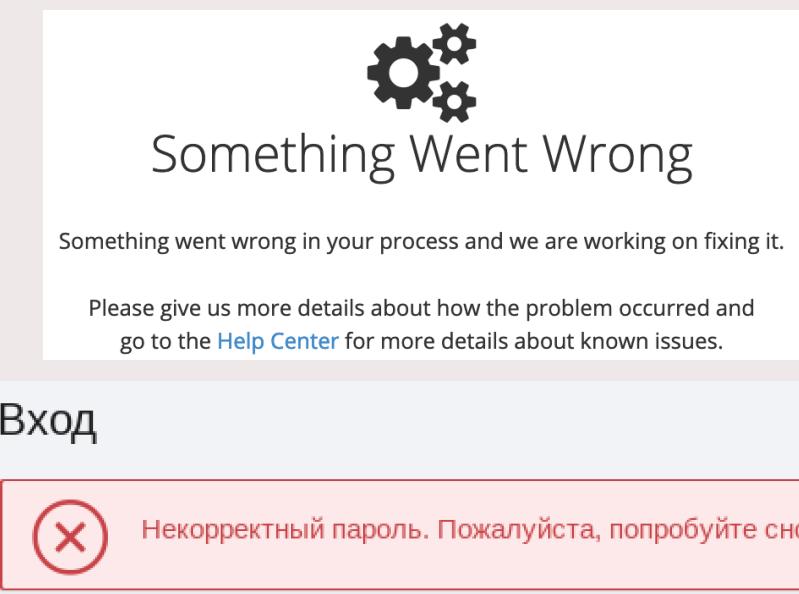
We need to better understand how it works

Open problems

Where do actual threats appear?



How to get the data?



We need effective techniques and tools for the scientific community for stealth data extraction



Main question and contributions

Which marketplaces foster innovation, and how to monitor them?



Stealth data extraction from monitored marketplaces

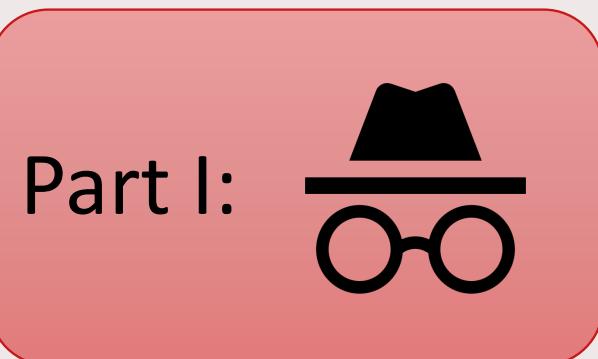


Identification and study of emerging threats



Characterization of high-profile markets

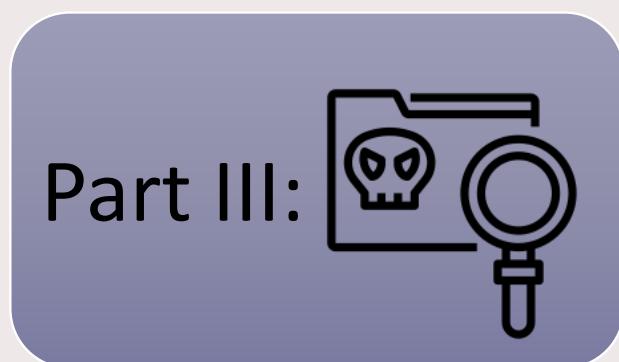
Overview of contributions



Method for stealth data extraction
Open-source tool available



Characterization of novel IMPaaS threat model
Analysis of targets across the globe
Findings instrumental to Genesis Market takedown



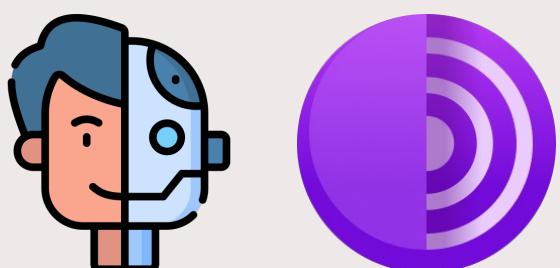
Identification of “successful” markets

	Key Partners				Key Resources				Key Activities				Value Proposition				Cst. Rel.	Customer Segments				Revenue Streams		Cst. Str.																								
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Fakhar	✓	✓	✓	✓	✓	-	-	-	-	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓					
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Identification of “successful” markets

A stealth, trainable & extensible tool to extract data from cybercriminal markets: THREAT/crawl

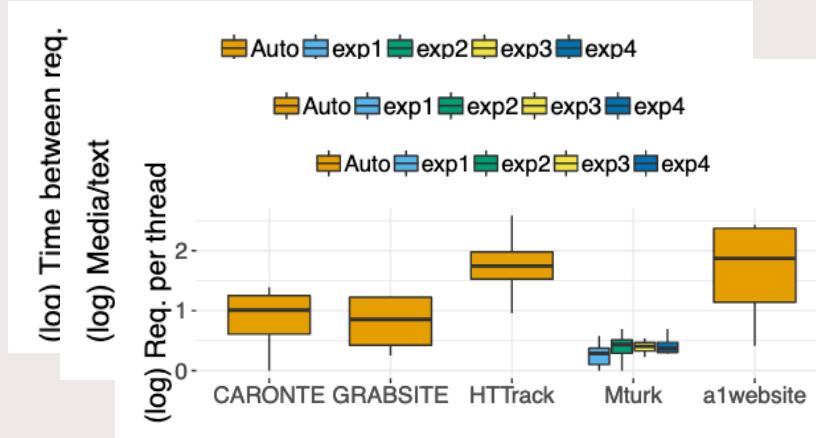
Human-like behavior +
browser



Simple interface +
learning + extensible

The screenshot shows a web browser window with the XSS.js interface. The main area displays a login form with fields for 'Имя пользователя или email' and 'Пароль'. To the right, there's a sidebar titled 'JavaScript to execute:' containing a text input field and a dropdown menu set to 'Log-in page'. Below this are sections for 'Navigation labels' (Home), 'Data labels' (Section title, Subsection title), and 'Input labels' (Username, Password, Submit login). Buttons for 'TRAIN STRUCTURE' and 'RESET STRUCTURE' are also present.

Promising stealth results via experiments against humans



Encouraging results on
learning, covering edge cases

	Train	Crawl	Time _{total}	Time _{breaks}	WPM	Download img	JS exec	CF tickets	Threads	Posts
crdclub	✓	✓	4:05:52	40:45	180 – 240	✓	✗	✗	1	330
nulled	✓	✗	-	-	180 – 240	✓	✓	✓	-	-
xss	✓	✓	3:51:40	42:46	180 – 240	✓	✗	✗	1	580
altenen	✓	✓ [†]	3:31:12	28:29	180 – 240	✗	✓	✗	94	1'691
nulledbb	~✓	✗	1:04:54	00:00	180 – 240	✓	✗	✗	4	13
deeptor	~✓	✗ [‡]	08:12 [‡]	00:00	180 – 240	✓	✗	✗	1	10
darknetcity	✓	✓ [†]	3:31:29	44:15	600 – 800	✗	✗	✗	6	1'451

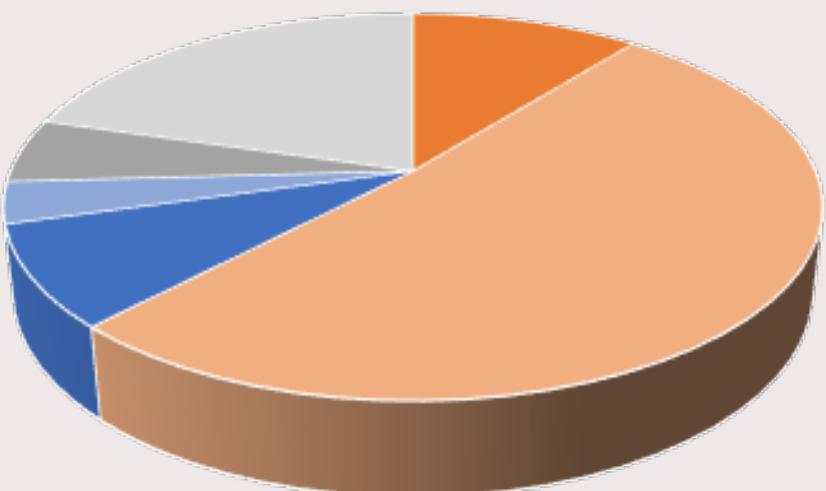
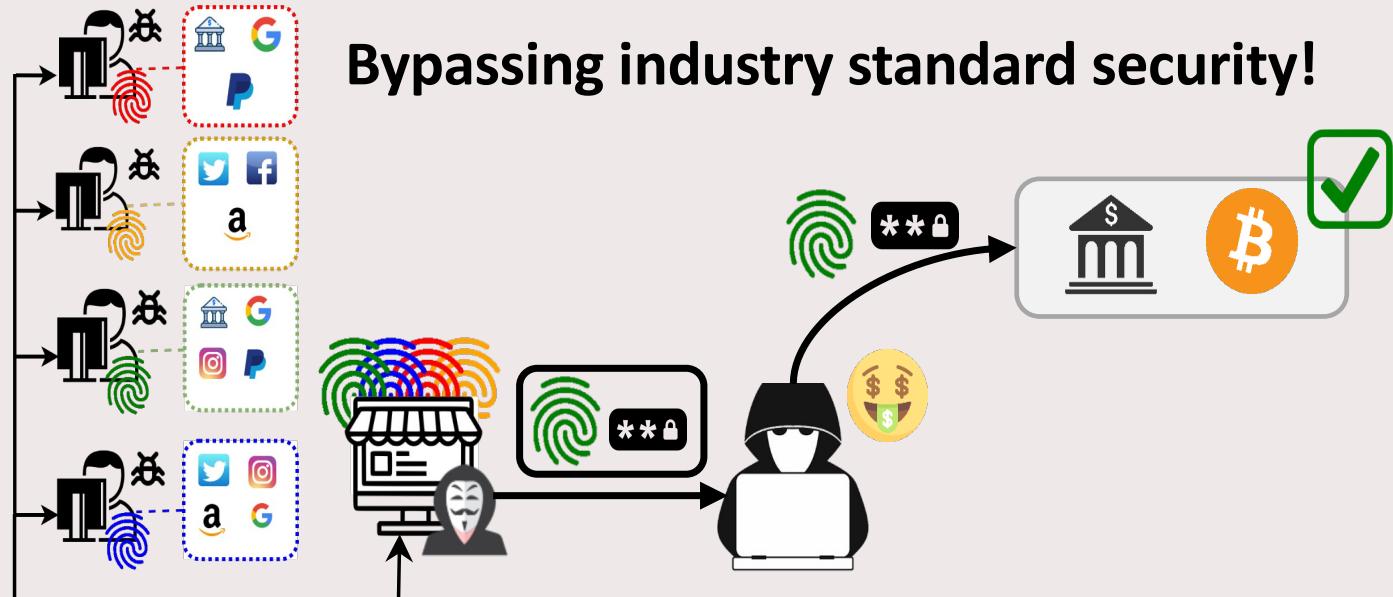
[†]: premature termination due to connectivity issues with the target; [‡]: manual termination of the tool due to wrong behavior during crawling.

Prototype released

Method for stealth
crawling overall valid

Studying attackers from global emergent threat: The case of Genesis Market

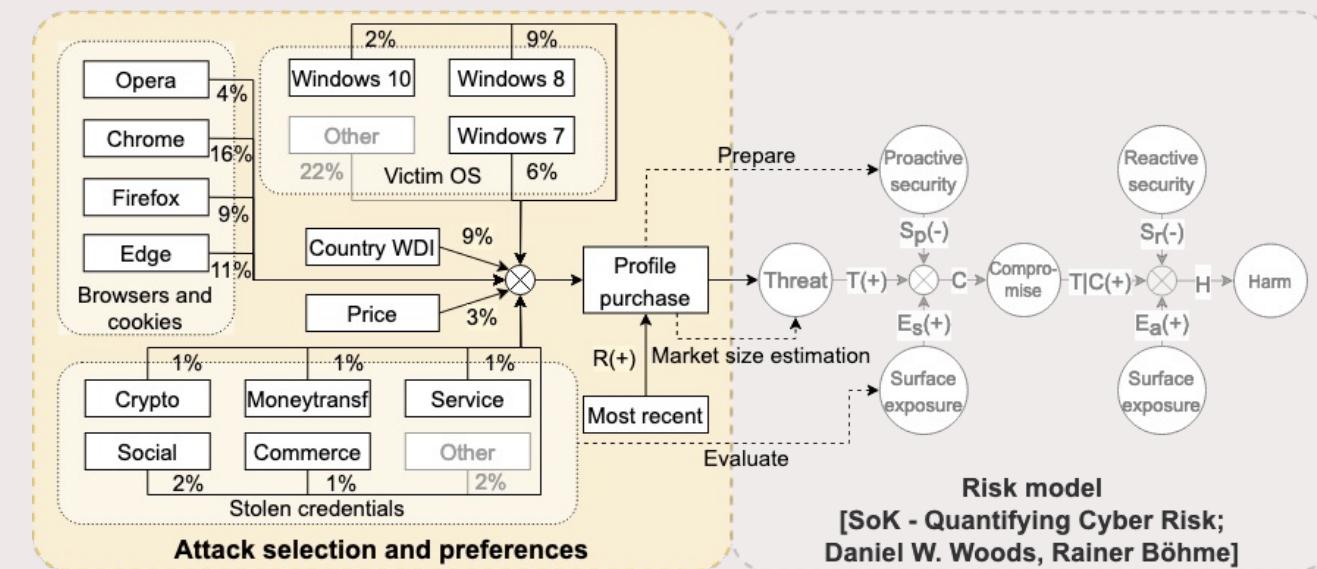
Bypassing industry standard security!



EU supply: 62% (!)
 — Sold EU: 17%
 — Unsold EU: 83%
 NA supply: 12%
 — Sold NA: 71% (!)
 — Unsold NA: 29%
 Other supply: 26%

Our estimate:
1.2–1.6M\$ revenue per year

✓ 17 countries involved, 119 arrests worldwide
 8M\$ in revenues over ~5 years of activity



“Good” markets for a thriving economy

“Latest iPhone, 85% off, buy now!” “Apple iPhone 15 256GB - Black”
verylegitmarketplace.com bol.com



No refunds, seller unreachable



Seller rated 9.5/10, verifiable
seller history, refunds possible,
customer service

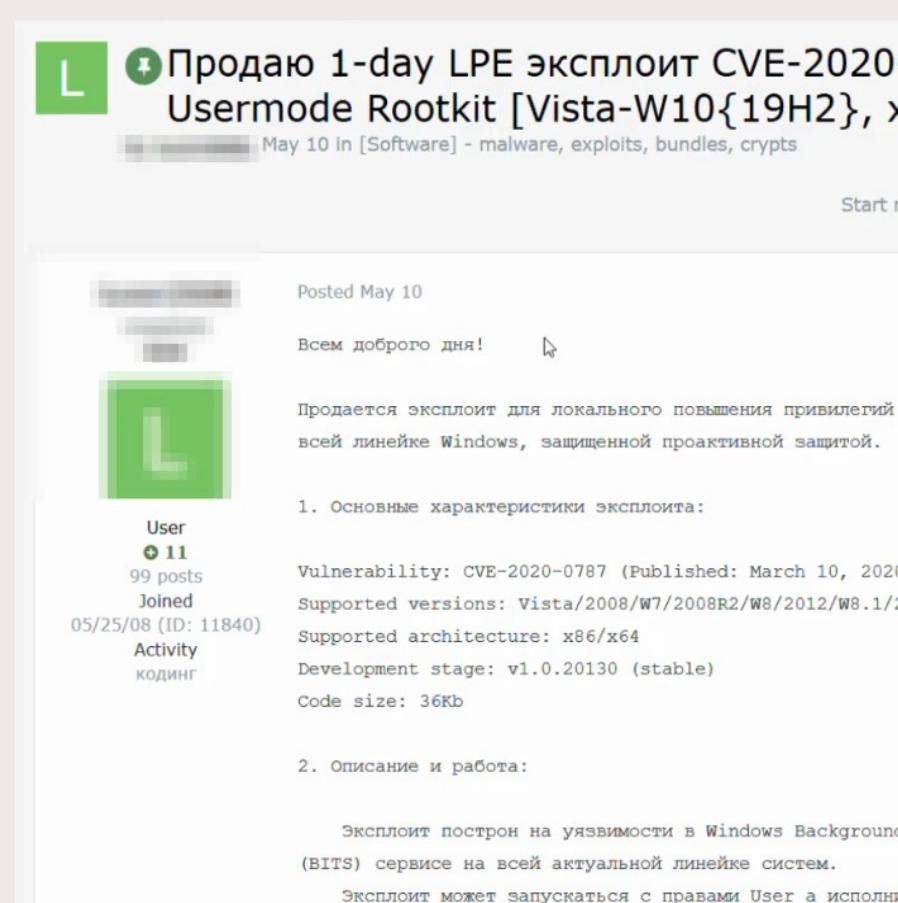
“Good” markets for a thriving economy

“Hack Anyone’s Device, 8\$!”
anotherverylegitmarketplace.com



No refunds, seller unreachable

1-day LPE exploit WIN10
exploit.in



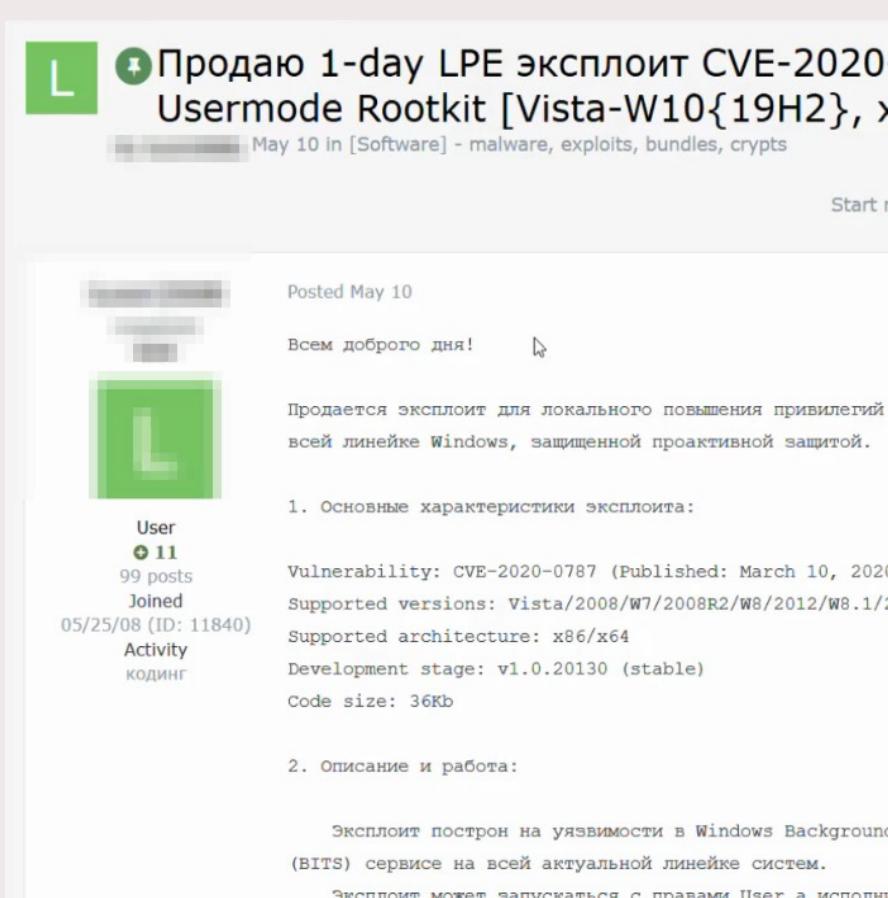
Seller rated 9.5/10, verifiable
seller history, refunds possible,
customer service

“Good” markets for a thriving economy

“Hack Anyone’s Device, 8\$!”
anotherverylegitmarketplace.com



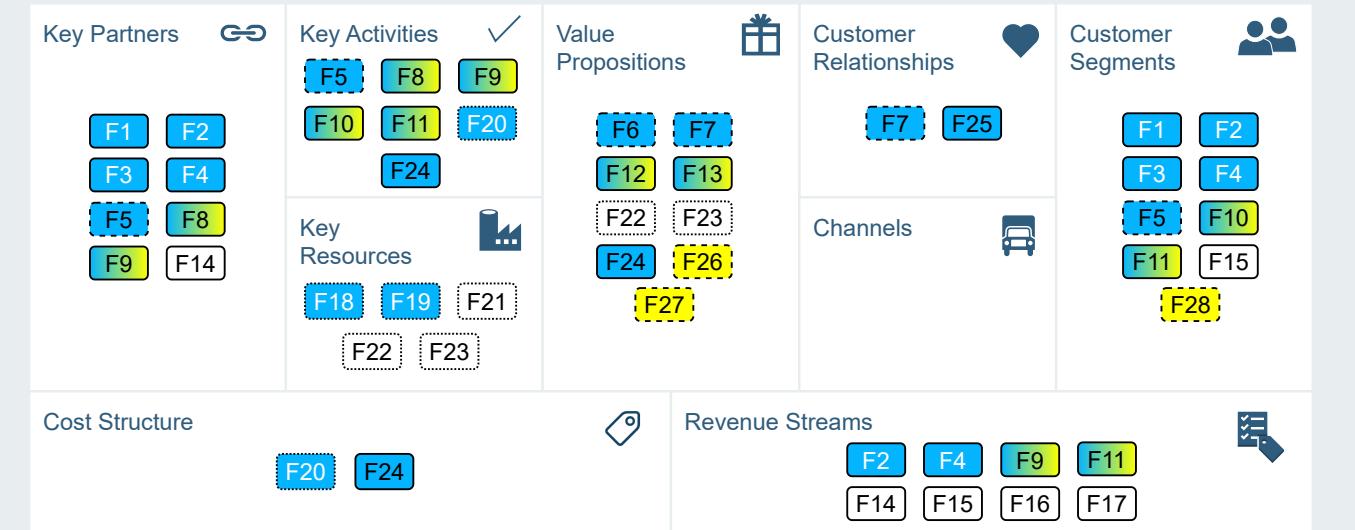
1-day LPE exploit WIN10
exploit.in



Seller rated 9.5/10, verifiable
seller history, refunds possible,
customer service

Market features mitigating trade problems

The Business Model Canvas

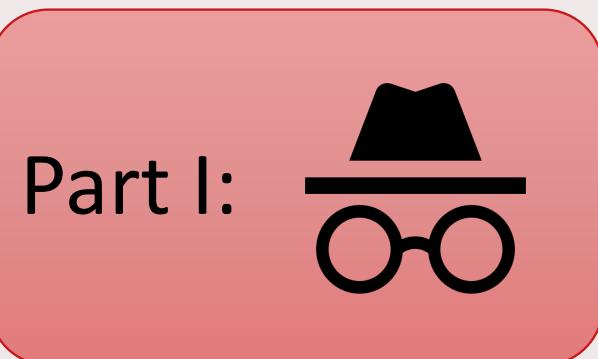


“Good” markets are more segregated,
have stricter seller verification,
admins are not involved in trade

A tool to identify the most
damaging markets



Overview of contributions



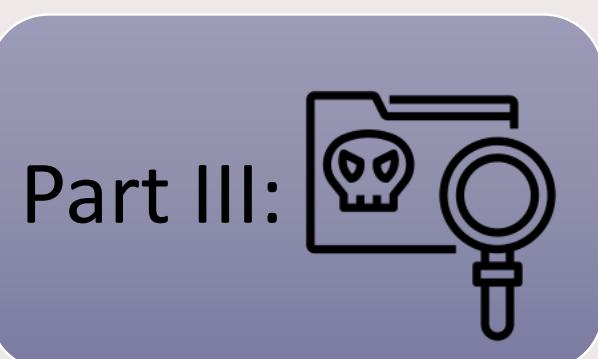
Method for stealth data extraction
Open-source tool available



Characterization of novel IMPaaS threat model
Analysis of targets across the globe
Findings instrumental to Genesis Market takedown



Belangrijke verdachte in
operatie 'Cookie Monster'
opgepakt: 50.000 Nederlandse
bestolen



Identification of “successful” markets

	Key Partners				Key Resources				Key Activities				Value Proposition				Cst. Ref.	Customer Segments				Revenue Streams		Cost Str.																			
	F1	F2	F3	F4	F5	R1	F14	F18	F19	P21	P22	P23	I5	F8	F9	F10	F11	F20	F21	F22	F23	F24	F25	F1	F2	F3	F4	F5	F10	F11	F12	F13	F14	F15	F16	F17	F18	F19	F20	F21	F22	F23	F24
RaidForums	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓					
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Cracked	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓	✓					