### Issued for Abuse

Measuring the Underground Trade in Code Signing Certificates

Kristián Kozák<sup>♦</sup>, Bum Jun Kwon<sup>★</sup>, Doowon Kim<sup>★</sup>, Tudor Dumitraş<sup>★</sup>



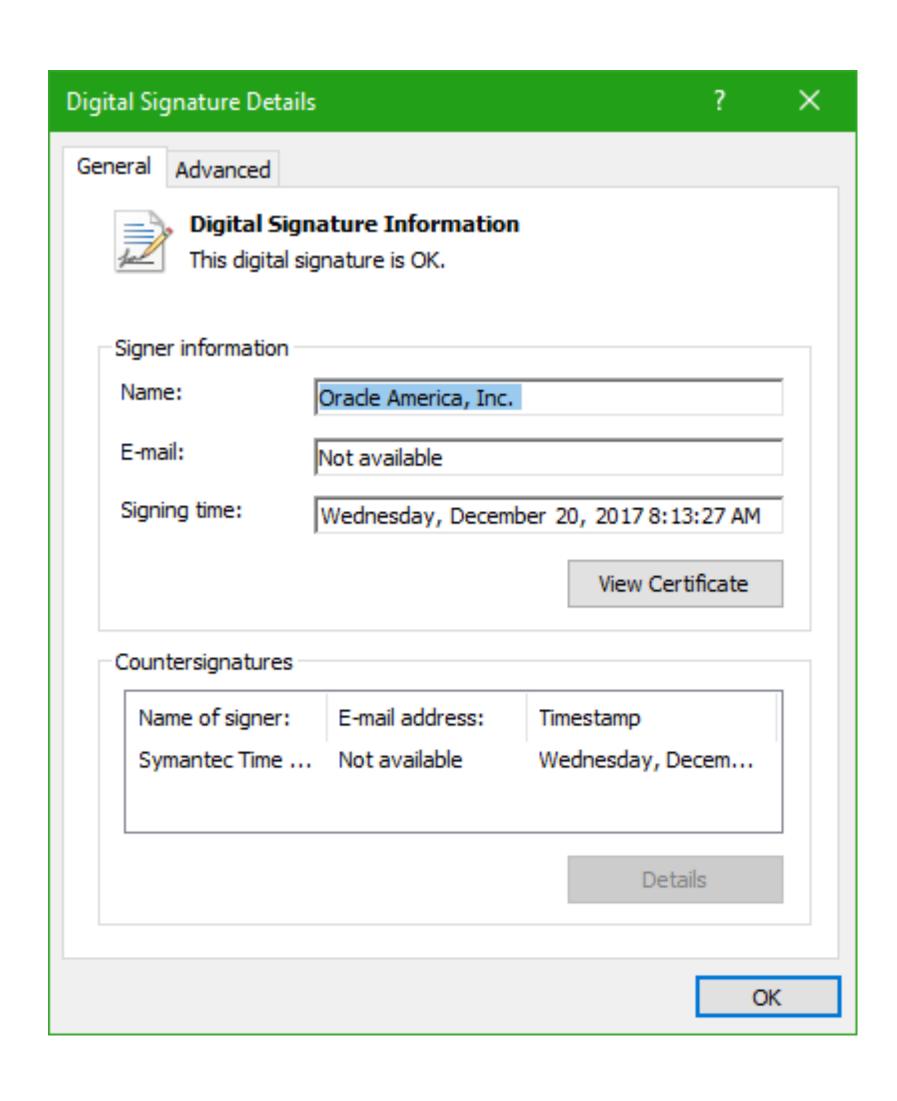


Masaryk University, Brno





# Code Signing: Overview



#### Code Signing Certificate:

Binding a signing key to a software publisher.

User Account Control Do you want to allow this app from an unknown publisher to make changes to your device? Publisher: Unknown File origin: Hard drive on this computer Show more details No Yes

# Anonymous Certificates

Code signing designed to prevent anonymous publishers

PUP: Fine with code signing [Kotzias 2015]

Malware: Needs anonymous signatures [Kim 2017]

Where do the malware authors get the valid signatures?



What is their business model?

### Research Methods & Goals

#### Black markets for code signing not studied systematically yet

Hard to formulate hypotheses a-priori

#### Inductive approach (hypotheses from data)

Gather evidence about the activity of underground vendors

Analyze usage of certificates in signed malware

Infer the role of the black market in the production of signed malware

#### Passive measurement

No influence over black market (exception: responsible disclosure)

### Data Collection

Supply view

Observation of the black market

Manual analysis: August 2017

Automated collection of stock

information: Sep-Nov 2017

Demand view

Analysis of signed malware dataset

Collected: Apr-Aug 2017

### Supply: Where is the black market?

#### Challenges

Past reports: E-shop already down

No goods at SilkRoad (data by [Christin 2013])

No goods among other general marketplaces

#### Data collection

#### Start

Set of known sites

#### Expansion

Following links & handles

#### Saturation

No new sites anymore

Some remain inaccessible

# Demand: Collection & Clustering

#### VirusTotal Hunting + Filtering

14,221 *correctly signed* malware samples1,163 abusive certificates

#### Clustering of publisher identities

```
Ltd "Vet Fektor"

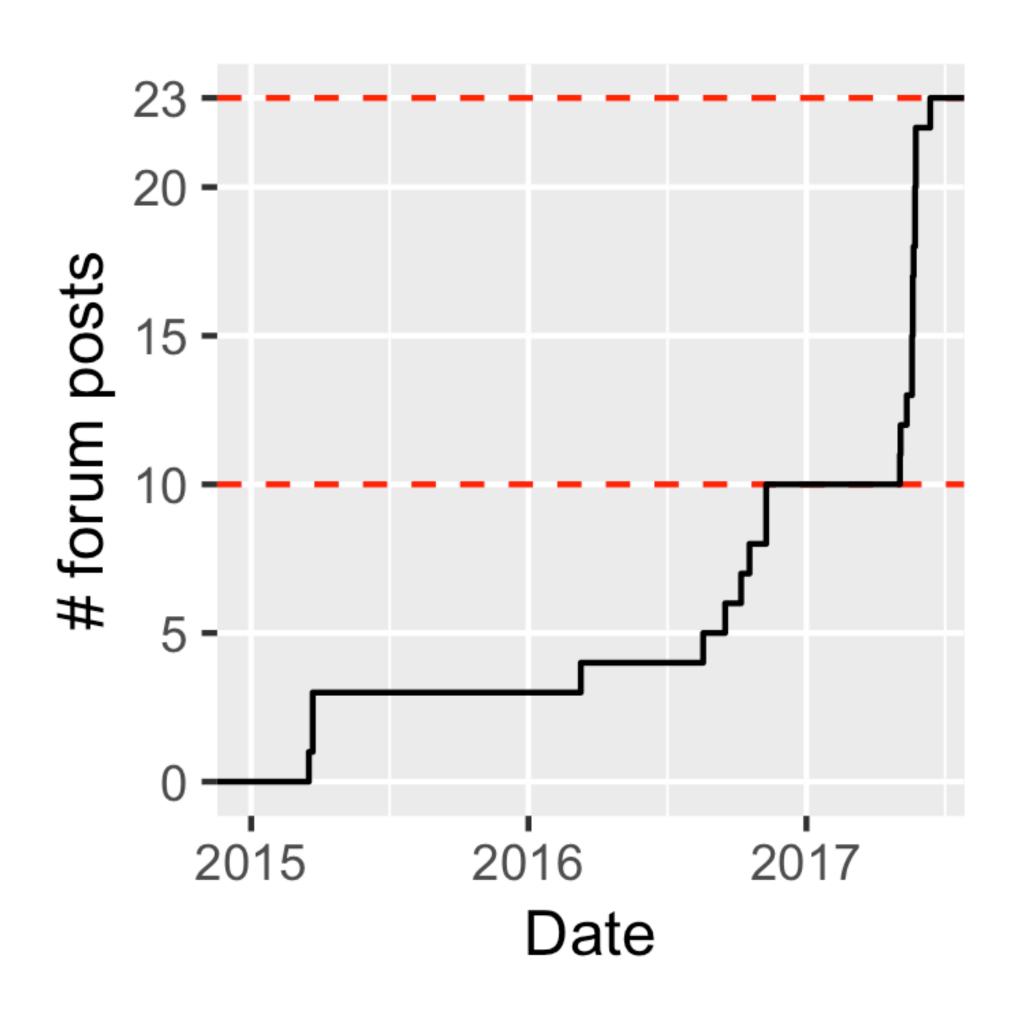
000, Vet - Fektor

LLC `VET FEKTOR`
```

**AVClass: Malware family labeling** 

Graph analysis

# Vendors and Activity



#### Business on forums + one new e-shop

4 vendors identified, each across multiple forums

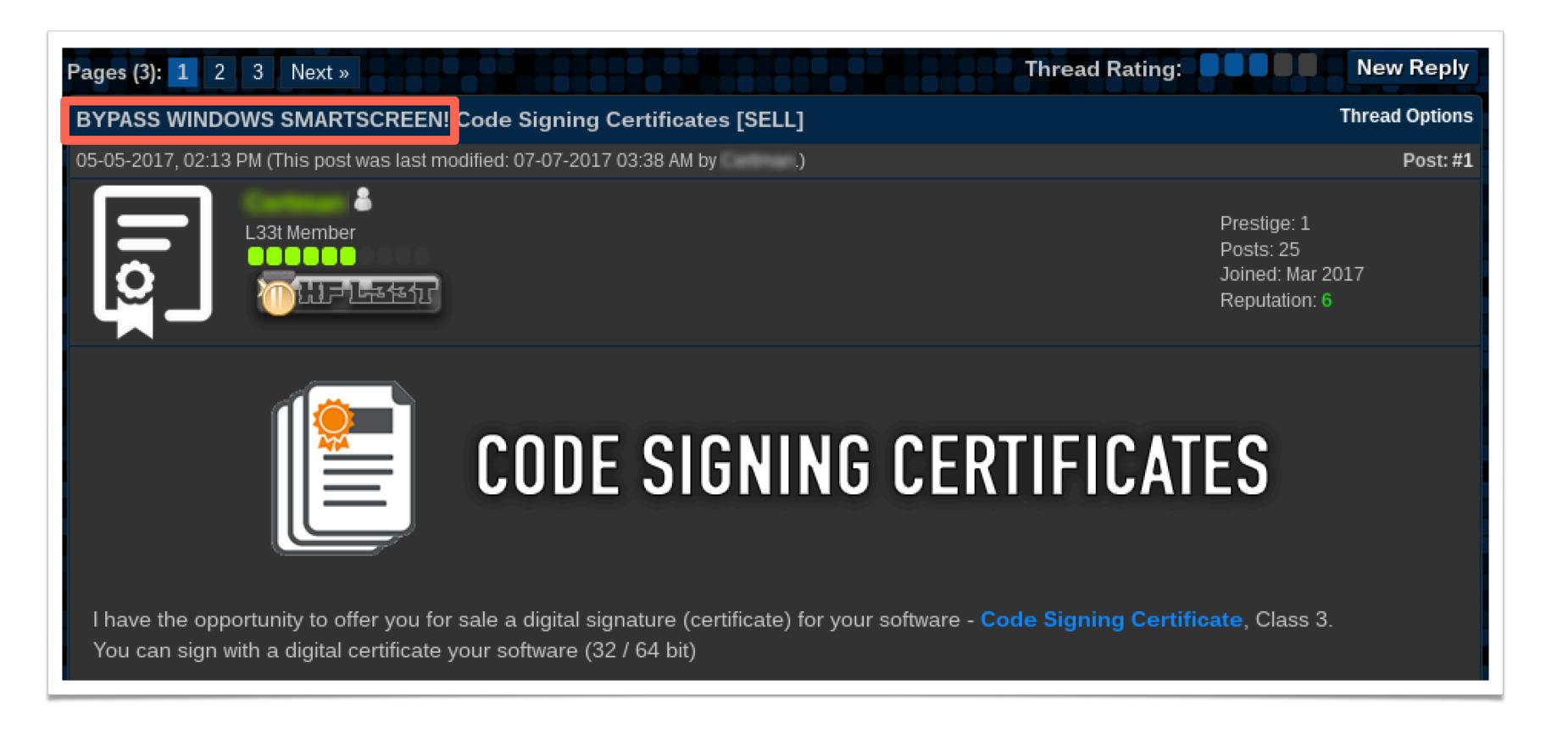
Post count increased more than 2-fold in early 2017

### Mechanisms and Business Model

#### Selling anonymous code signing certificates

No evidence of other business models (signatures, PPI)

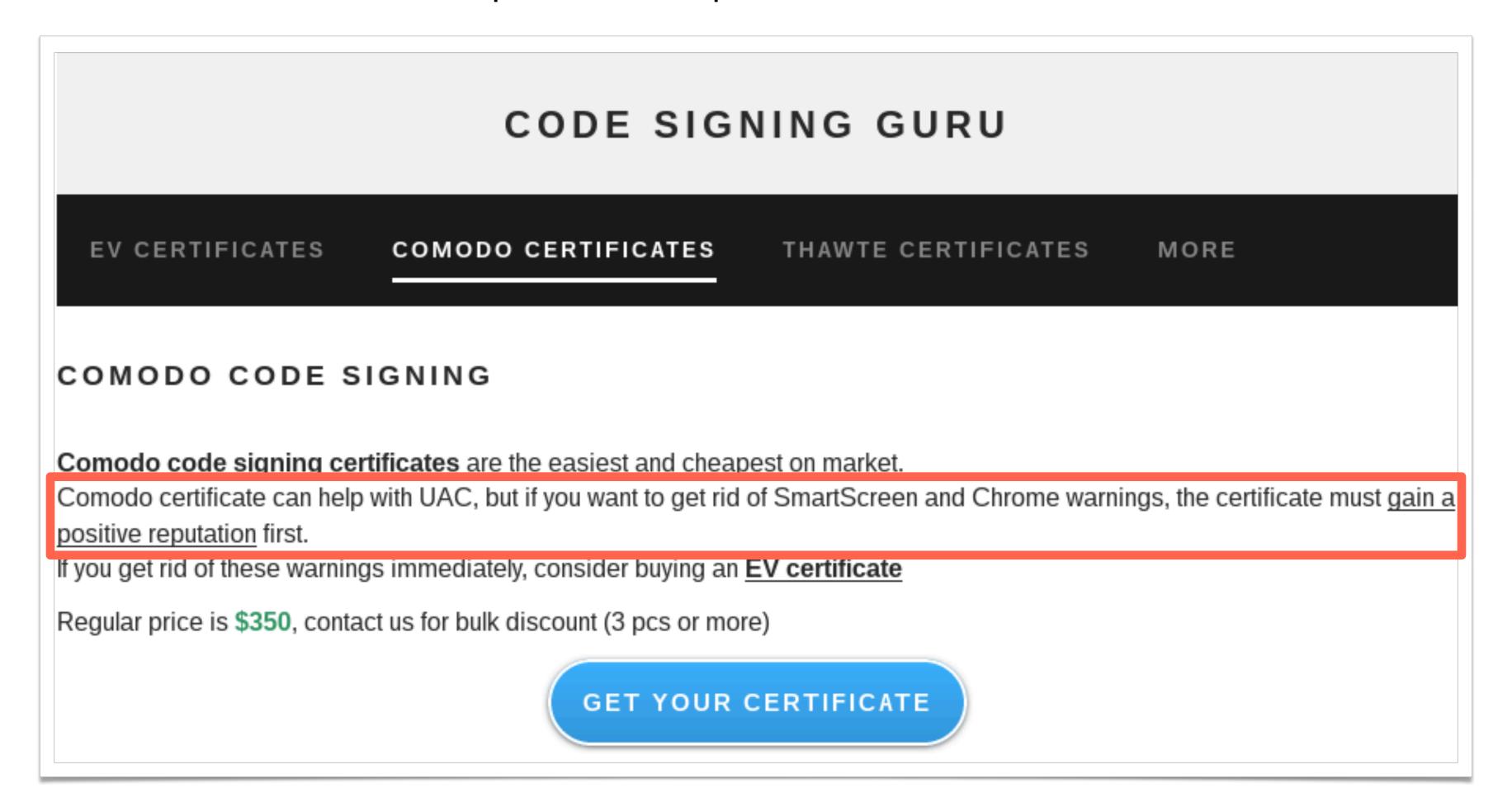
Each certificate is fresh, never used and sold only once



# Driving the Demand

#### SmartScreen appears to drive the demand

Bypass SmartScreen = Build positive reputation



# Origin of the Certificates

#### Supply side view

Vendors: Certificates are fresh + 1 year of validity

Lying ⇒ Loosing reputation ⇒ Sales more difficult

#### Demand side view

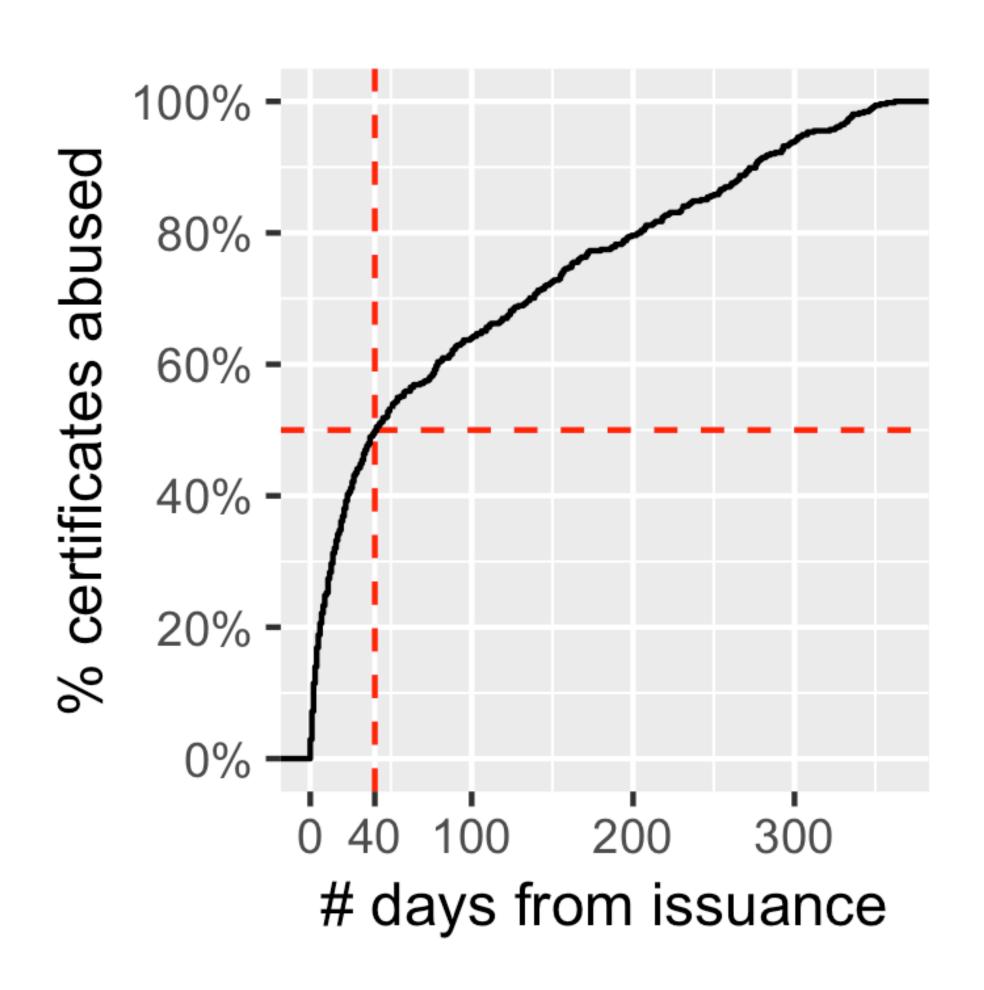
Are the certificates compromised or obtained from the CAs?

Prior methods [Kim et al., 2017] no longer usable

Idea: Interval between issue date and abuse date

- We compute an upper bound
- Assumption: Compromised certificates are uniformly likely to be stolen
   & abused during their lifetime

### Certificate Origin: Issue to Abuse Interval



50% abused within the first 40 days

Certificates likely obtained from CAs directly

Not compromised from legitimate publishers

⇒ Contrary to previous reports

### Sales Volumes: Evidence

#### Forums

Sales take place in private

Vouches & Stock updates provide limited insight

#### E-shop

3rd party payment component loaded on front-end

Providing the count of certificates on stock

Plus the date of stock updates, later used for linking the certificates

# Sales Volumes: Estimate (E-shop)

Certificate	Regular (\$)	Black Market (\$)
Comodo	85	350
Thawte	300	600
EV (Comodo)	320	3,000

#### Observed sales

Sales of 41 non-EV certificates observed EV certificates sold in private

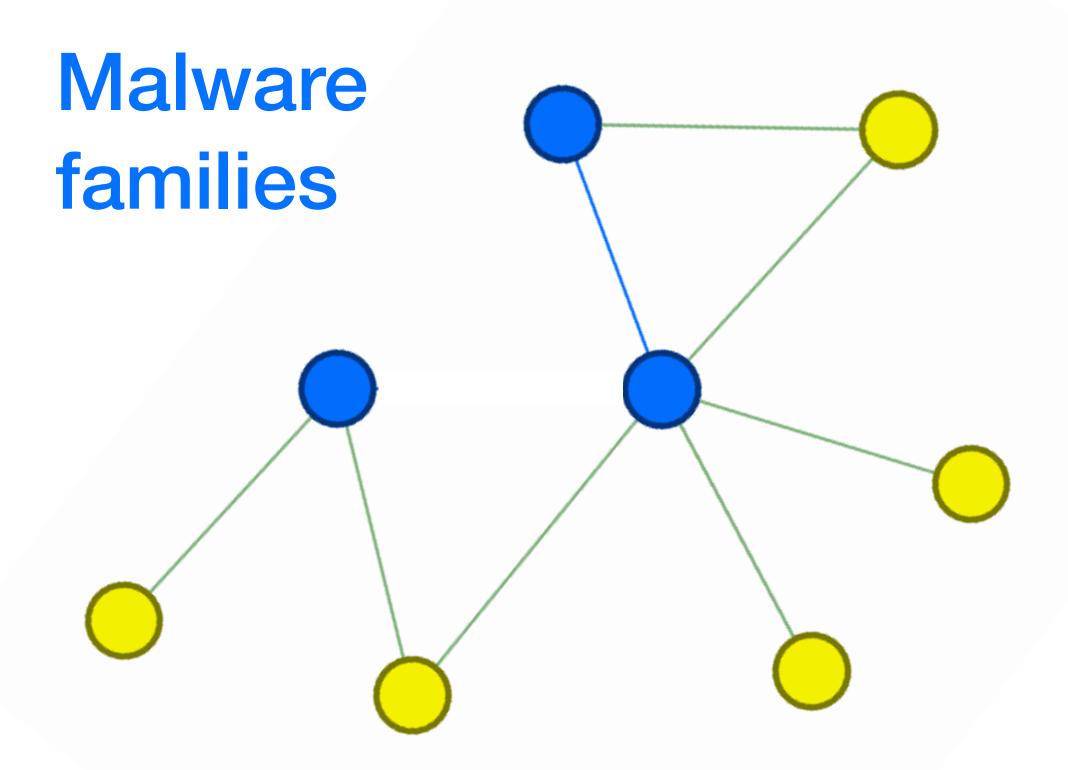
Duration	Revenue (\$)	Max. Profit (\$)
Month	4,600	2,850
Total	> 16.000	9,850

Vendors may incur additional costs for setting up fake identities etc.

# Relationships

#### Certificate = a link

- between a publisher & a malware family
- between two malware families



Publisher Identities

Major Component

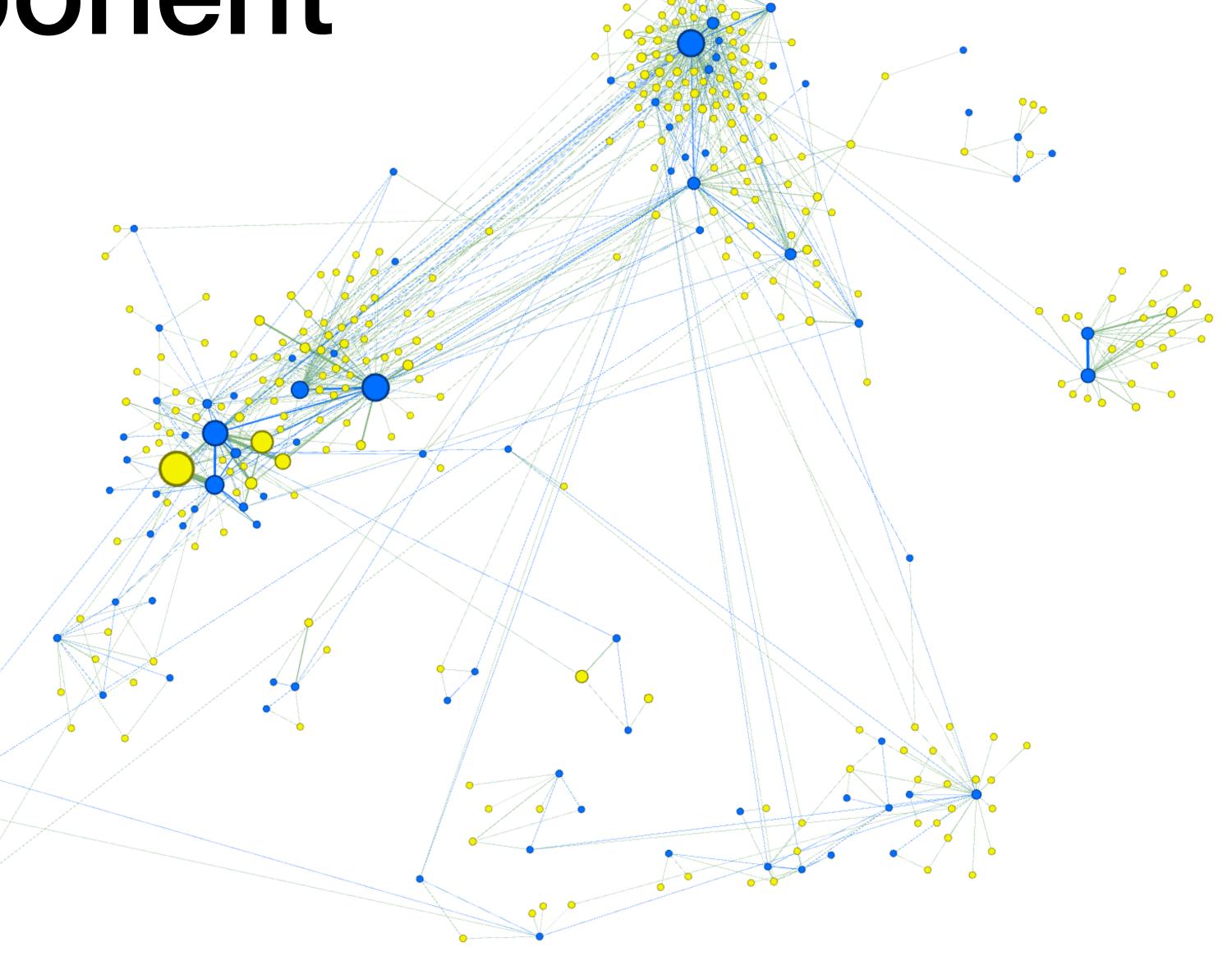
#### Contains

90% of malware samples

70% of certificates

50% of malware families

mostly Russian publishers



# Major Component **Properties** Indicates smaller dev teams Strong connectivity (= cooperation?) Faster certificate abuse rate

### Conclusions

Business model: Trading code signing certificates

Growing demand

Certificates appear to be obtained directly from CAs

Evidence consistent with a reliable supply of certificates

Market confidence, vendors able to respond to demand

Hypothesis: Use of shell or impersonated companies

Recommendation: Standardise the publisher name format

Data release: www.signedmalware.org

### Publications

#### **WEIS 2018**

Issued for Abuse: Measuring the Underground Trade in Code Signing Certificates

Kozák, K., Kwon, B. J., Kim, D., Dumitraș, T.

17th Annual Workshop on the Economics of Information Security (WEIS 2018)



The Broken Shield: Measuring Revocation Effectiveness in the Windows Code-Signing PKI

Kim, D., Kwon, B. J., Kozák, K., Gates, Ch., Dumitraș, T.

27th USENIX Security Symposium (USENIX Security '18)

# Thank you!

#### Kristián Kozák

kkozak@mail.muni.cz signedmalware.org

### Identifying Traded Certificates 1/2

Supply side: E-shop

Specified CA: Thawte

Claimed on a forum: British publishers

Observing stock: Issue date

Observed stock updates: occurred on 9 / 104 days

#### Assumptions

Vendor puts certificates in stock immediately

Vendor did not lie (about British publishers)

### Identifying Traded Certificates 2/2

#### Matching criteria

Supply side: Thawte, British publisher, 9 potential issue dates

#### Demand side: Signed Malware Dataset

145 certificates issued during 104-day observation period

10 are by Thawte; 11 have a British publisher

5 are by Thawte & have a British publisher

All 5 match a potential issue date

#### Likelihood: If a cert is equally likely to be issued on any day ...

1 match by chance: p = 9 / 104 = 8.7%

5 matches by chance:  $p = (8.7\%)^5 = 0.0005\%$