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# Quantitative assessment of risk reduction with cybercrime black market monitoring

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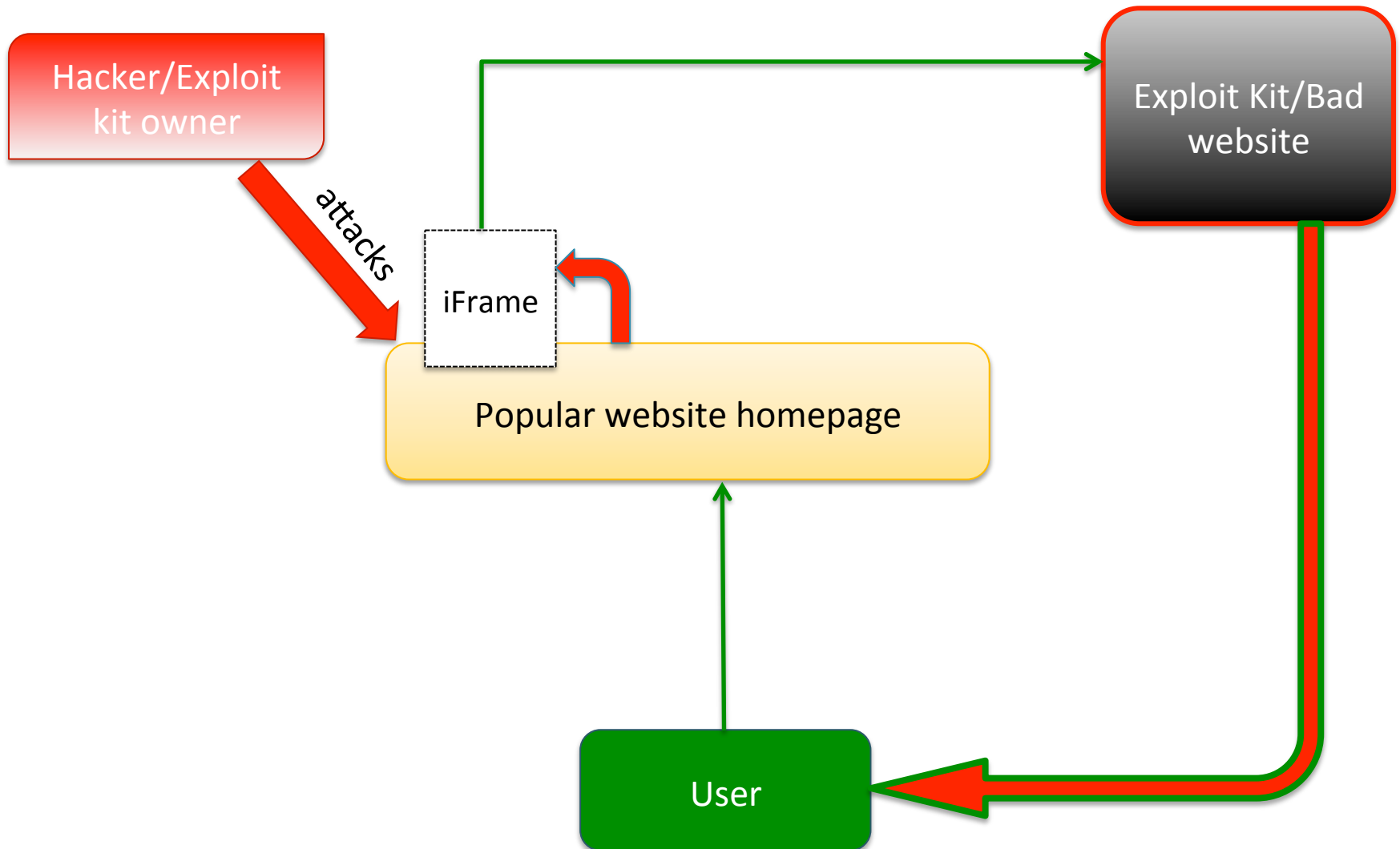
# Outline

- Motivation
- Questions
- Data
  - Attacks
  - Black markets
- Preliminary observations
  - Vulnerability risk score (CVSS) vs attacks
  - Black market vulnerabilities vs attacks
- “Effectiveness” of patching policies
  - Methodology
  - Results
- Conclusions

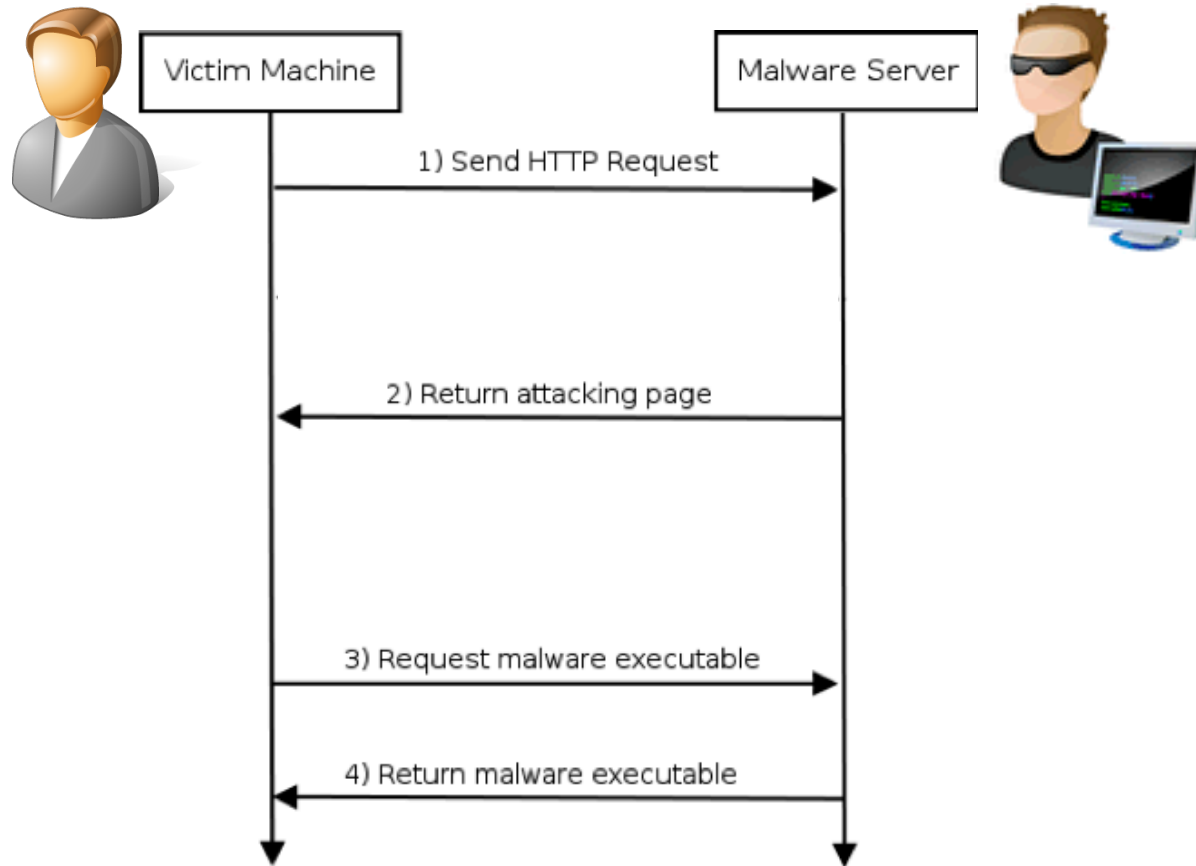
# Motivation

- Software vulnerabilities are main vector for attacks against the users
- Patching is **critical**
  - Too many, users are bothered
  - How to prioritize?
- Patches **priorities** by means of **CVSS scores**
  - High score -> vulnerability is attacked
  - Low score -> ignore for now
- Observation: **Drive-by-downloads** responsible for **70% of infections** [Google 2011]
  - Cybercrime black markets trade very popular drive-by-infection tools: **Exploit kits**

# Drive-by-download attacks



# Drive-by-download attacks



# Our question(s) here

- **Are black markets relevant** for the final user security?
- Does it make sense to use **vulnerability information** from the **black markets** to design patching policies?
- Two-steps:
  1. Check for relevance of exploit kits vulnerabilities in the general attack scenario
  2. Develop a **model** to estimate **the reduction in risk** by using a typical **CVSS**-based strategy and a **BlackMarket**-based strategy.



# Databases

- NVD: National vulnerability database, universe of vulnerabilities
- EKITS: **vulnerabilities** traded in the **black markets**
  - Made in Italy (University of Trento)
  - Substantial expansion on Contagio's Exploit Pack Table
  - Semi-automated retrieval of vulnerability data

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♥ 23.03.2011, 19:44

**Средний пробив на связке: 10-25%**

\* Пробив указывается приблизительный, может отличаться и зависит напрямую от вида и качес **Апдейт до версии "Eleonore Exp v1.6.5"**

\* Отстук стандартный, даже чуть выше стандартного:

> Зевс = 50-60%

**Exploitation and infection success rate**

> Лоадер = 80-90%

**\*Rate highly depends on traffic quality**

**Цена последней версии 1.6.x:**

> Стоимость самой связки = 2000\$

→ **Latest prices**

> Чистки от АВ = от 50\$

> Ребилд на другой домен/ИП = 50\$

} **Additional services**

> Апдейты = от 100\$

\* Связка с привязкой к домену или IP .

**В состав связки входят следующие эксплойты:**

> CVE-2006-0003 (MDAC)

> CVE-2006-4704 (WMI Object Broke)

> CVE-2008-2463 (Snapshot)

> CVE-2010-0806 (IEpeers)

> CVE-2010-1885 (HCP)

> CVE-2010-0188 (PDF libtiff mod v1.0)

> CVE-2011-0558 (Flash <10.2)

> CVE-2011-0611 (Flash <10.2.159)

> CVE-2010-0886 (Java Invoke)

> CVE-2010-4452 (Java trust)

\*Виста и 7ка бьется





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  - Monitoring **90+ exploit kits, 1.5yrs**
  - **126 vulnerabilities** growing

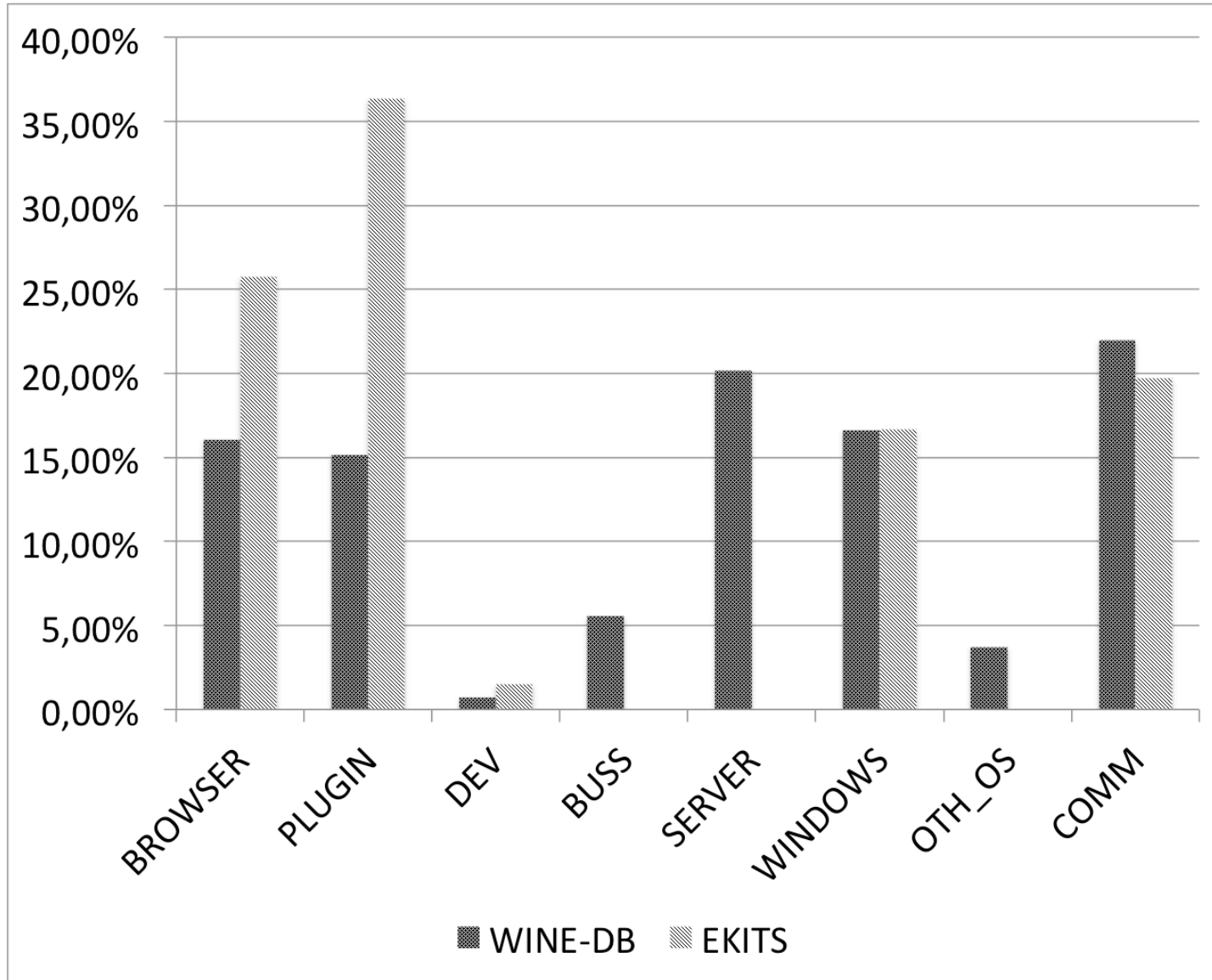
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  - **Monitoring 90+ exploit kits, 1.5yrs**
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- WINE-DB: **attacks delivered in the wild**
  - Collaboration with **Symantec WINE** data sharing programme
  - **600+** exploited vulnerabilities
  - $\sim 10^8$  attacks recorded
  - .. However, we have no data on users' software configurations (other than the OS)

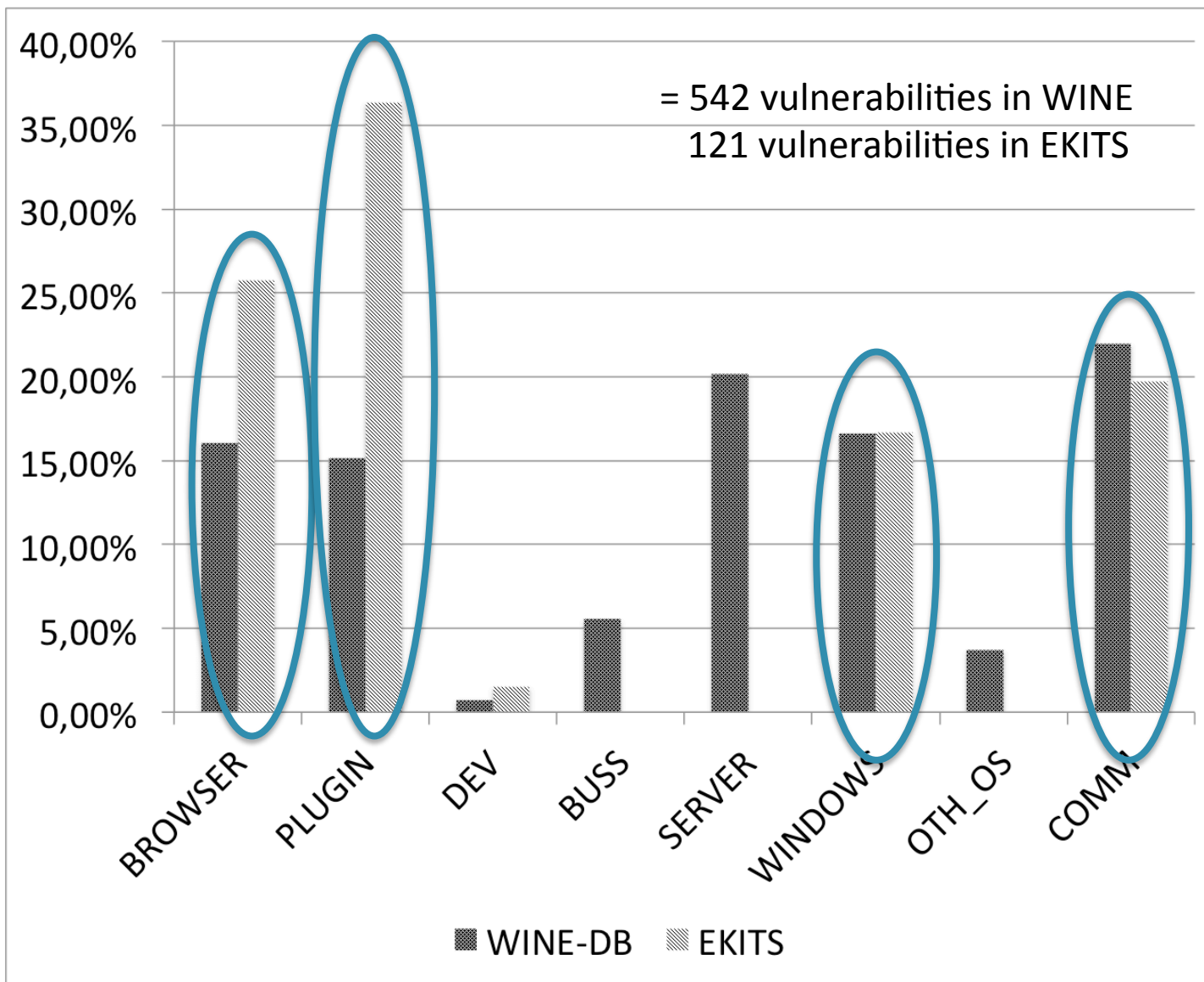
# Data categorization

Category	Type of software	Examples
1. BROWSER	Browser software	Internet Explorer, Firefox,
2. PLUGIN	Browser plugins	Acrobat reader, Adobe Flash Player
3. DEV	Software intended as support for developers	Visual C++
4. BUSS	Software used mainly in business environment	Lotus Notes, Dreamweaver
5. SERVER	Server side software	Apache, Ftp daemons
6. WINDOWS	Microsoft Windows releases	Windows XP, Windows Vista
7. OTH_OS	Operative systems other than Microsoft Windows	Solaris, OpenBSD
8. COMM	“Common-usage” software	Microsoft Office, Eudora

# Data categorization



# Data categorization





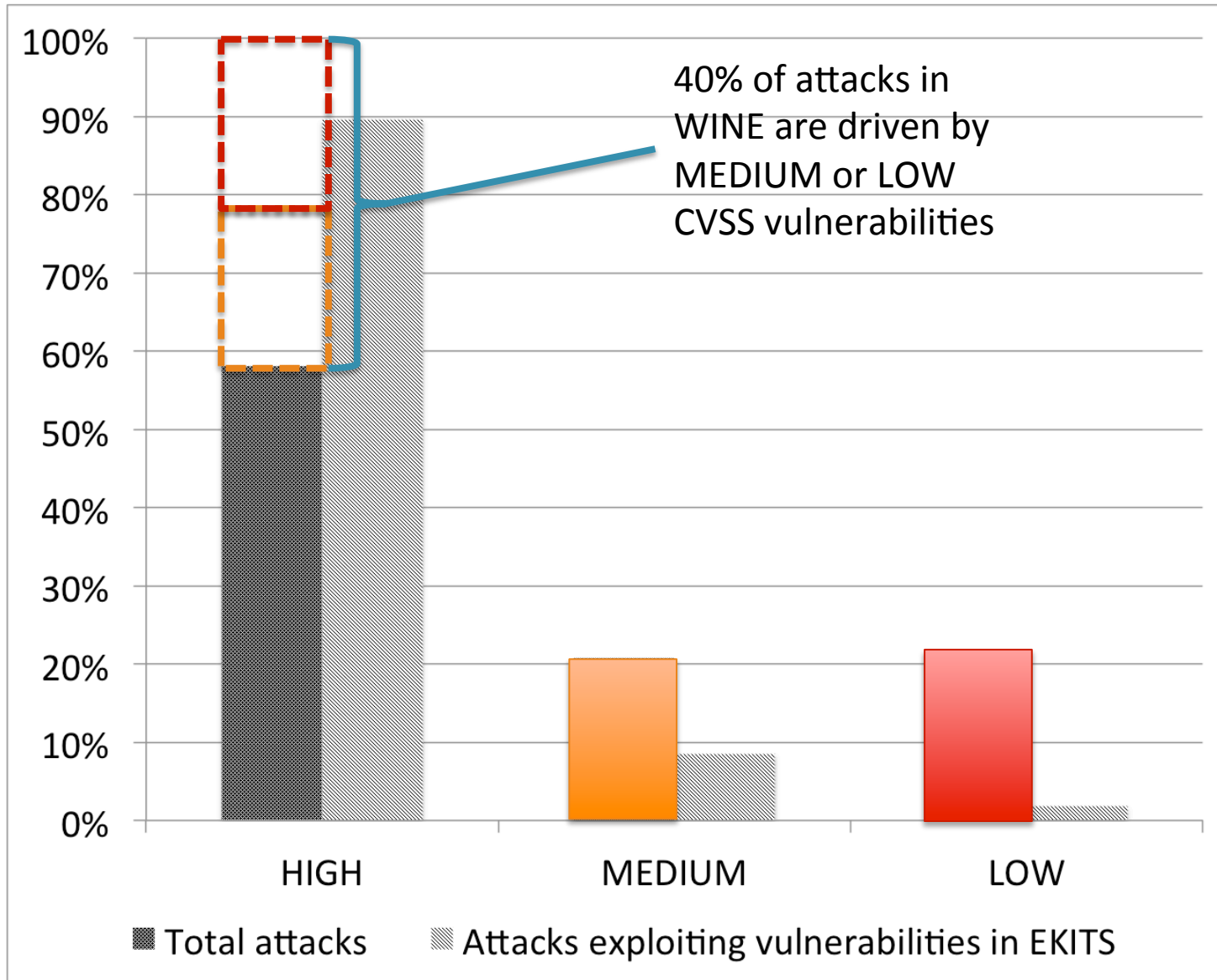
# 1. Observational analysis of data



# Preliminary: Does CVSS look good?

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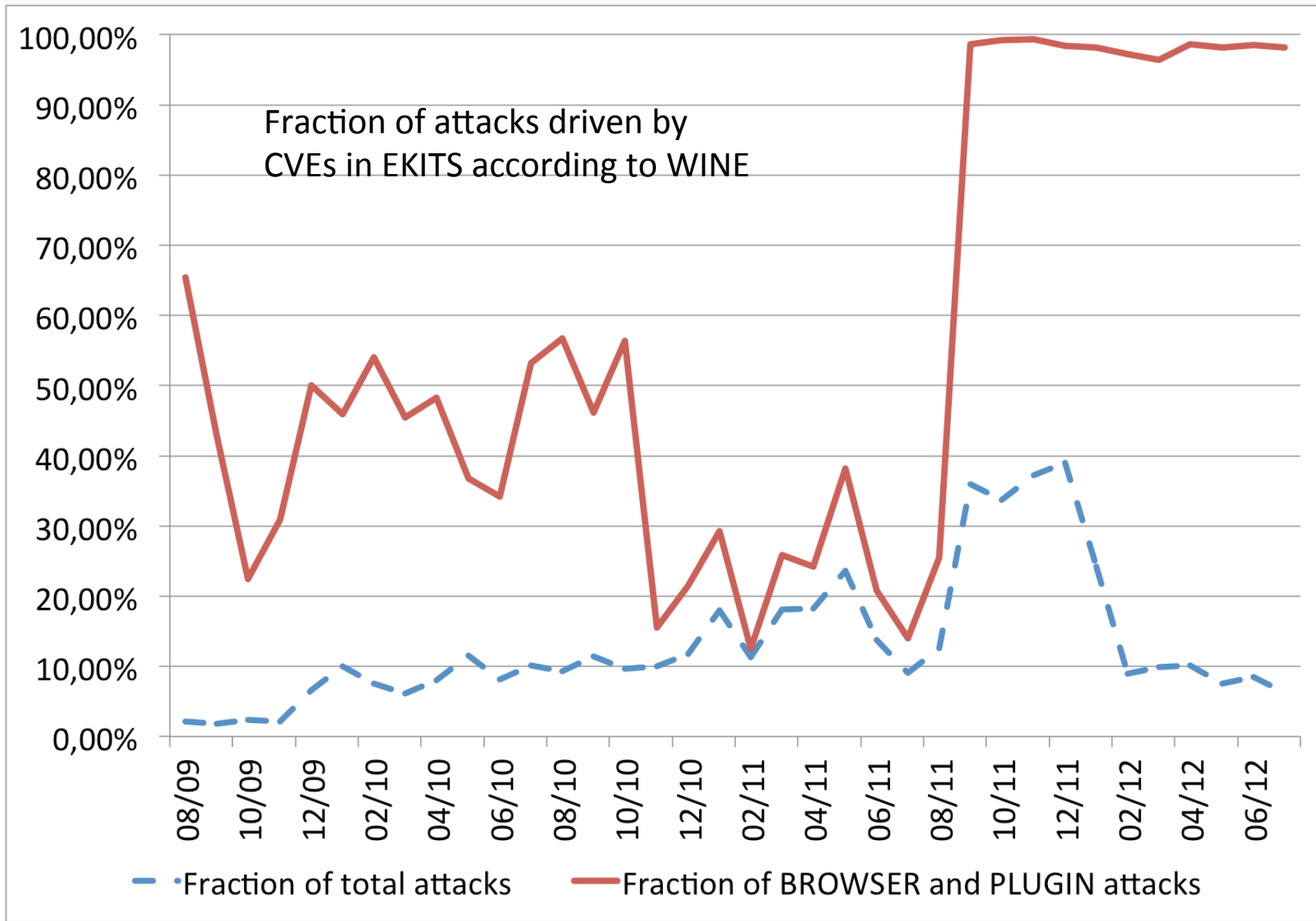




# Preliminary: Do ekits look interesting? (1)

- Fraction of **attacks** driven by CVEs **in EKITS** according to WINE
- Relative probability of receiving an attack by means of a vulnerability in EKITS rather than one NOT in EKITS

# Preliminary: Do ekits look interesting? (1)



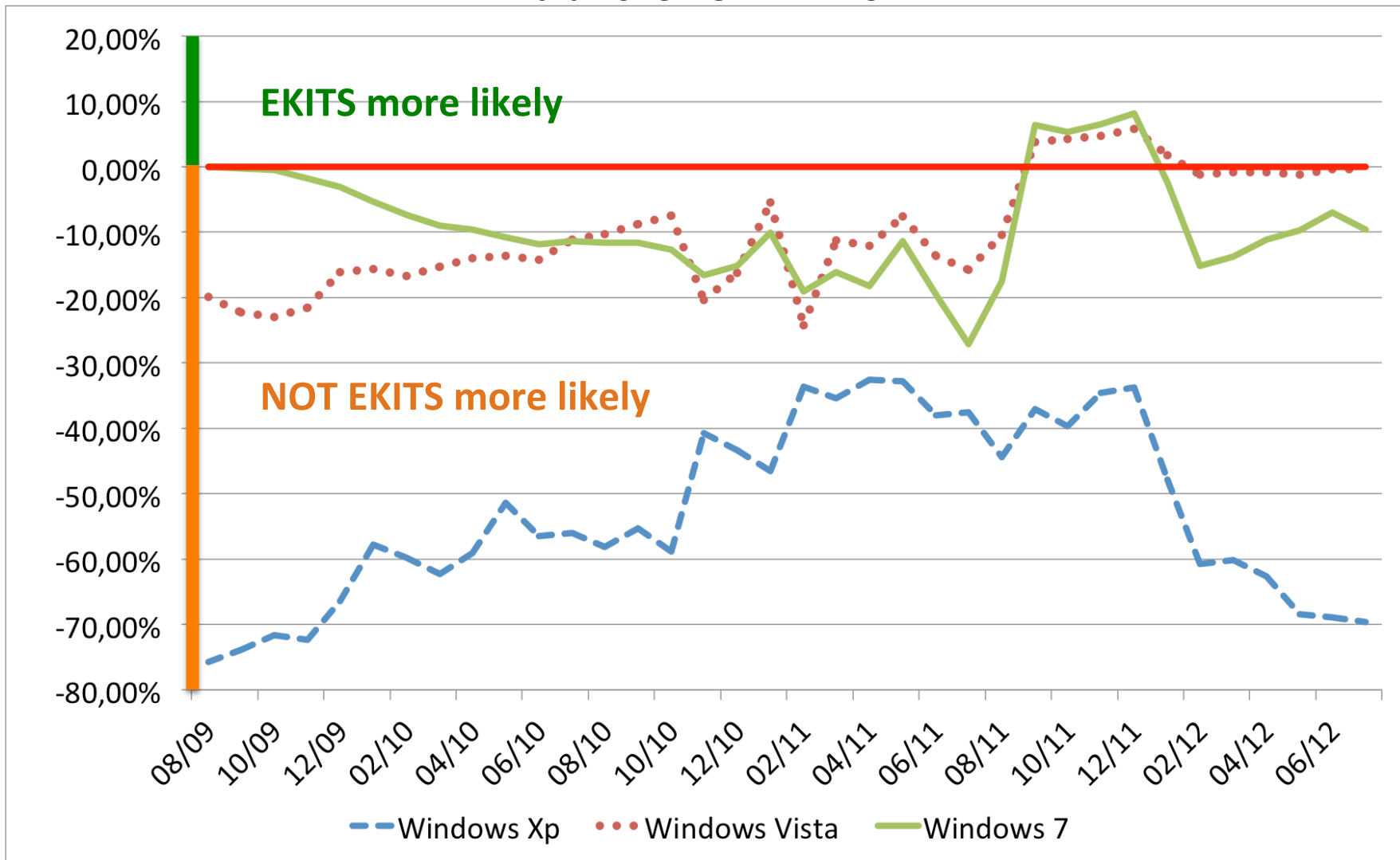
# Preliminary: Do ekits look interesting? (2)

- Fraction of attacks driven by CVEs in EKITS according to WINE
- **Relative probability** of receiving an attack by means of a vulnerability in **EKITS** rather than one **NOT in EKITS**
  - Breakdown by operating system

$$\Pr(v \text{ in EKITS} \mid \text{attack}) - \Pr(v \text{ not in EKITS} \mid \text{attack})$$

# Preliminary: Do ekits look interesting? (2)

Relative probability of receiving an attack by means of a vulnerability in EKITS rather than one NOT in EKITS



# Preliminary conclusions

- CVSS does a good job but leaves **40%+ of the attacks uncovered**
- Vulnerabilities in **exploit kits** drive between **10% and 40% of attacks** received by the final users
- Exploit kit vulnerabilities **dominate** the scenario for attacks against **browsers** and **plugins**
- Probability of exploitation of vulnerabilities in **EKITS** (121) is **comparable to ~EKITS** (421)



2. Does it make sense to use vulnerability information from the black markets to design patching policies?

# The method

- A patching strategy is like **safe belt** usage
  - Does **not assure** you **do not die** in a car accident
  - But **decreases your chances** of dying **by X%**  
(seatbelts: ~43% according to [Evans 1986])
- We paraphrase and adapt Evans' methodology
  - Strategy to select vulnerability to be **fixed** -> wearing **seatbelt**
  - You receive an **attack** -> you have a **car crash**
  - You are **not patched** and get infected -> crash is **fatal**

# The method (1)

- “**Patching effectiveness**” = decrease in attacks if policy A is enforced instead of policy B
  - A = **High risk** vulnerabilities are **patched**
  - B = **Low risk** vulnerabilities are **patched**
- CVSS case:
  - A. High risk = vulnerability has HIGH CVSS
  - B. Low risk = vulnerability has LOW+MEDIUM CVSS
- EKITS case:
  - A. High risk = vulnerability is in the black markets
  - B. Low risk = vulnerability is not in the black markets



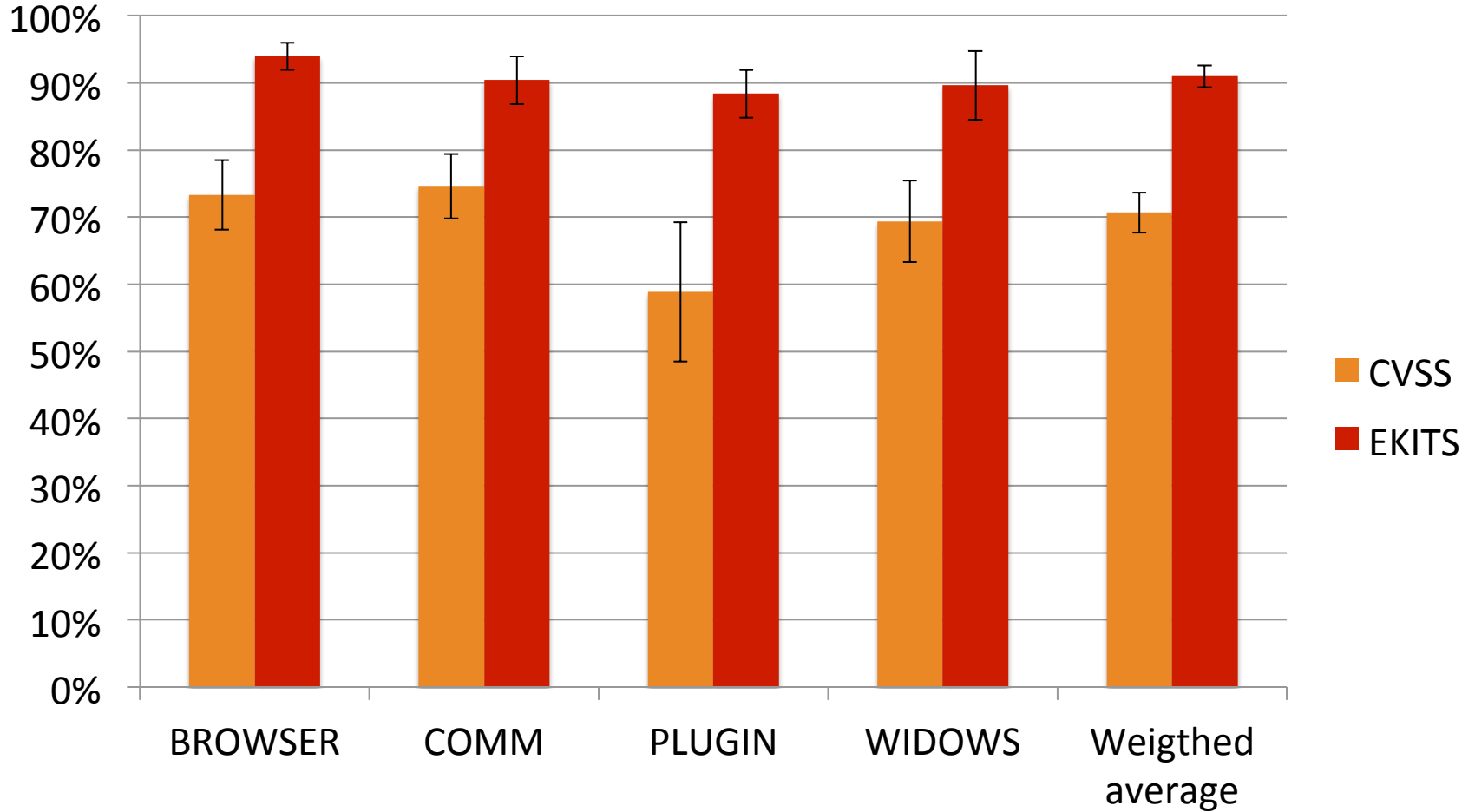
# The method (2)

- “If I were to enforce patching policy A, how many less attacks than with B would I receive?”
- General formulation:

$$\Pr(\textit{attack} \mid \textit{risk.type} = B) / \Pr(\textit{attack} \mid \textit{risk.type} = A)$$

- Two assumptions
  - A user may be affected by **any vulnerability in NVD**
  - WINE-DB includes **all exploits** in the wild, that can be used by any attacker with the same probability

# Results: Effectiveness



# Conclusions

- Cybercrime **black markets** are an **important source of risk** for the final user
- Active and efficient **monitoring** of the markets may lead to more **efficient patching strategies**
- **Efficacy of patching** strategies seems to vary with the “**category**” of the vulnerable software
  - There may be a need for “ad-hoc” policies for different software products



# Questions

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Thanks