

# Studying Malicious Websites and the Underground Economy on the Chinese Web

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**Abstract** The World Wide Web gains more and more popularity within China with more than 1.31 million websites on the Chinese Web in June 2007. Driven by the economic profits, cyber criminals are on the rise and use the Web to exploit innocent users. In fact, a real underground black market with thousands of participants has developed, which brings together malicious users who trade exploits, malware, virtual assets, stolen credentials, and more. In this chapter, we provide a detailed overview of this underground black market and present a model to describe the market. We substantiate our model with the help of measurement results within the Chinese Web. First, we show that the amount of virtual assets traded on this underground market is huge. Second, our research proves that a significant amount of websites within China's part of the Web contain some kind of malicious content: our measurements reveal that about 1.49% of the examined sites contain malicious content that tries to attack the visitor's browser.

## 1 Introduction

The World Wide Web (WWW) becomes more and more important each day within China. A large number of Chinese Internet users enjoy the convenience and flexibility the Web brings them, from searching for information, online entertainment to e-business, and e-finance (CNNIC 2007). According to the latest Alexa Global top 500 websites list (Alexa 2008) (32 Chinese websites are in the list), there are four different types of successful and well-known sites within the Chinese Web: the first type of websites are search engines, including Baidu, Google.cn, Yahoo! China, Tencent's SoSo, and Suhu's Sogou. Among them, Baidu and Google are the most popular ones. The second category contains portals and navigation sites. Among the seven sites belonging to this category, Tencent's QQ,

Sina, NetEase 163, Sohu, and TOM are listed in the top ten Chinese websites. The third type of sites is related to e-business: the Taobao C2C (*customer-to-customer*) online business platform and the Alibaba B2B (*business-to-business*) platform – both operated by the Alibaba group – are well-known within the Chinese Web. The last type of sites contains sites in the area of online entertainment and virtual personal space, including YouTube-like sites such as 56.com, toodou, ku6, several myspace-like sites such as poco, bokee, and others.

But there is also the other side of the coin: targeting the virtual assets owned by the normal Chinese Internet users, malicious attackers discover the Web as a new venue for making money by exploiting innocent users. A common theme is to inject malicious code into a bought or compromised website. The injected code exploits an unpatched client-side vulnerability: each time a user with a vulnerable version of a browser or related application visits this site, his machine is compromised and some kind of malware is automatically installed. This kind of attack is also called *drive-by-download attack* (Wang et al. 2006). The malware is quite often some kind of Trojan Horse that searches for valuable information on the victim's machine and then sends the information back to the attacker, who in turn can sell this virtual good to other attackers or innocent users.

In this chapter, we study this phenomenon on the Chinese Web in more detail. We propose a model to describe the underground economy which drives the malicious websites phenomenon and the individual actors within this ecosystem. The model describes the underground economy that we have studied within the Chinese Web, and thus some aspects of it are specific to China. However, our model can also be used to describe the market for malicious tools and stolen goods for other parts of the Web or the Web as a whole. Our measurements show that there are thousands of participants within this market and there are strong relations between the underground black market and the public virtual assets trading. Furthermore, we also measure the extent of malicious websites within China's part of the Web with the help of client honeypots. During our measurement of about 145,000 of the most commonly visited websites on the Chinese Web, we found that 2,149, i.e., 1.49% of them, contained some kind of malicious content. We also performed redirection link analysis which can disclose the relationship between malicious websites and the hosts of web-based exploits, as well as the top active exploiters.

This chapter is outlined as follows: In Section 2, we provide an overview of related work in the area of malicious websites and the underground black market. We introduce a model to describe the underground economy and the different actors within this ecosystem, together with a case study, in Section 3. In Section 4, we show different mechanisms used by attackers to create malicious websites which we found by studying a large amount of actual attacks on the Chinese Web. The results of a measurement study on the underground black market and malicious websites within the Chinese Web are presented in Section 5. Finally, we conclude the chapter in Section 6.

## 2 Related Work

The work most closely related to ours is a study on the underground black market by Franklin et al. (Franklin et al. 2007). The authors study a large number of underground IRC channels and keep track of advertisements for virtual goods. Based on the collected information, they examine the size of the underground black market, the number of virtual goods traded, and similar characteristics. Our work is orthogonal to the work by Franklin et al.: We study the aspects of the underground market visible as part of the World Wide Web. We examine the relationship between the individual actors within the market and also study the size of the actual market via different metrics. Furthermore, we also propose a model for the underground economy and substantiate our model with the help of real-world data collected on the Chinese Web. Other studies orthogonal to ours focus on different aspects of the underground economy (Cymru 2006; Thomas and Martin 2006).

One of the first research efforts to analyze malicious websites were published by Wang et al. (2006) and Moshchuk et al. (2006). The key idea in both projects is to automatically browse the Web and analyze all content in order to detect sites that try to infect an unprotected user. Both projects show that such an effort is viable and they could detect malicious sites in an automated way. We extend the original idea by combining ideas from both projects in order to achieve a more scalable solution that still has the capability of detecting unknown exploits. The most detailed overview of the threat posed by malicious websites is given by Provos et al. (Provos et al. 2007; Provos et al. 2008). Using Google's cache of crawled websites, they analyzed the extent of this threat and could give, for the first time, numbers showing the maliciousness of a significant part of the Web. We focus on the Chinese Web and show that this part of the Web also hosts a significant amount of malicious content. In addition, we also analyze parts of the Web that are not easily reachable by Google, e.g., the virtual goods offered at the Taobao online business platform or the advertisements posted at the Baidu Post Bar. The HoneyNet Project has released several papers which deal with the phenomenon of malicious websites. One of the papers deals with attacks against web applications (HoneyNet Web Application 2007), while the other focuses on client-side honeypots (HoneyNet Web Servers 2007). We extend the original idea of client honeypots by combining two techniques that allow us to significantly speed-up the analysis platform.

## 3 Underground Economy Model

### 3.1 *Modeling the Individual Actors*

In this section, we introduce a model to describe the interaction between different actors within the underground black market. We explain the economic aspects of the phenomenon and for each actor, we illustrate their role, what kind of information/goods they trade, and what the common price for such goods/services is. This model is adapted to the Chinese Internet, since the social aspects within China enable a unique ecosystem. However, our model can also be extended to describe the blackhat underground economy in other countries and is not specific to China per se.

#### 3.1.1 Virus Writers

*Virus Writers* are malicious Internet users driven by economic profits. They have a certain degree of technical background of computer networks and programming skills, e.g., they are able to find vulnerabilities in software (so called *0-day* vulnerabilities) themselves, or they use recently public disclosed vulnerabilities and the corresponding exploits. Furthermore, these actors have the technical skills to develop their own exploits or malware based on the original vulnerability reports and available exploit codes. Then they sell their tools and malware for profit, and provide evasion service to their customers.

To find potential customers, they post advertisements on the underground black market. The markets are typically online discussion boards, so called *bulletin board systems*, within the World Wide Web that are used for discussions. Furthermore, the boards provide a platform for sellers and buyers of this kind of resources. In addition, experienced Virus Writers often release some limited version of their tools or malware for free, in order to raise their status and reputation within the community.

We searched within the underground black market and found the following prices for typical “services” within this market: the market price of a Trojan is between tens to thousands Renminbi (RMB), and a package of powerful Trojan generator and evasion service can be up to several ten thousands RMB. 10 RMB is as of February 2008 equivalent to \$1.40 US dollar. This means that such software has a certain value and Virus Writers have the incentive to invest time and knowledge into this area.

#### 3.1.2 Website Masters/Crackers

The second actors within the underground market are *Website Masters* and *Website Crackers*. The administrators of certain personal websites attract visitors

with the help of free goodies, e.g., free movies, music, software, or tools. These websites often betray their visitors: they sell the traffic (i.e., *website visits*) of their websites to *Envelopes Stealers* (see next section) by hosting the web-based Trojans. This means that innocent website visitors are redirected via these malicious websites to other sites that then attack the victims. If the attack is successful, a piece of malware is installed on the victim's machine.

Website Crackers can also compromise well-known – but unsafe – websites by exploiting vulnerabilities that exist on these sites. Via the command line access on the compromised machines, they then redirect the traffic for this website to another malicious machine, i.e., they then sell the traffic of their victim's website. Our research revealed a market price of about 40 – 60 RMB per ten thousand IP visits.

### 3.1.3 Envelopes Stealers

“*Envelopes*” is a jargon word used in the underground market which means the stolen pair of account and password, i.e., the credentials for a given site. We will use this term throughout the chapter. *Envelopes Stealers* have very limited technical knowledge and commonly buy ready-to-use Trojans or even malware generators from Virus Writers, and website traffic from Website Masters/Crackers. All they need to do is to create a web-based Trojan network from which they can harvest envelopes: they combine a web-based Trojan (which exploits vulnerabilities in the browsers, underlying components, or related applications) with a conventional Trojan for stealing certain envelopes and link the generated Trojan to the bought websites.

They then sell the harvested envelopes to *Virtual Asset Stealers*, which we introduce in the next section. We found that the market price of an envelope varies from some Jiao to tens of RMB. They also sell access to the compromised machines, which are called *flesh chicken* (because “chicken” has the same pronunciation as “machine” in Chinese), in the underground market. The market price of a “flesh chicken” is between 0.1 – 10 RMB, thus it is rather cheap for an attacker to control a compromised machine.

### 3.1.4 Virtual Asset Stealers

*Virtual Asset Stealers* do not have any technical knowledge about hacking and programming, but they have a rather good understanding of the underground market itself. Typically, they know which online games are currently popular and which virtual asset (for example, equipment in games) can be sold for a good price. They buy envelopes from the *Envelopes Stealers*, and log-in to the online games or QQ accounts to steal valuable virtual assets like game equipments or QQ coins. Besides these monetary goods, these actors also steal other valuable, virtual

goods including “beautiful” QQ accounts, i.e., accounts with a short name, or a name that can be easily remembered.

After getting access to the virtual assets, they commonly sell them to others. Besides a prospering market for QQ accounts, we also found evidence that they sell other virtual assets like powerful equipments for various online games. The market price varies for each virtual good, e.g., game equipment is typically sold for 10 – 10K RMB/equipment, whereas 1 QQ coin commonly costs 0.2 – 0.3 RMB. It is interesting to observe that the official exchange rate by the vendor Tencent is 1 RMB for 1 QQ coin. During the “Super Voice Girls” competition, an annual national singing contest, the black market price rose to 0.3 – 0.5 RMB since enthusiastic fans were seeking QQ coins to vote for their favorite contestants.

### 3.1.5 Virtual Asset Sellers

Another party within the whole underground are the *Virtual Asset Sellers*, which can also be (but not need to be) Virtual Asset Stealers. They contribute to the circulation section of the industry chain by setting up virtual shops on the World Wide Web. These shops can be commonly found at Taobao, Tencent’s PaiPai, and eBay, the three biggest online business platforms within China.

Our research shows that the Virtual Asset Sellers usually buy the virtual assets from the underground market on bulletin board systems with a very low price. They then sell them to *Players* on the public marketplaces, making profit due to the price difference between buying and selling. For example, they typically buy QQ coins on bulletin boards and then sell the coins for 0.5 – 0.8 RMB on Taobao, making a certain profit with each transaction.

### 3.1.6 Players

The sixth actor within our economic model are the *Players*, who are enthusiastic online games players (or QQ users), often spending large amounts of money on virtual assets. The Players are commonly male teenagers who dispense their parents’ money for fun on the World Wide Web and in online games. They are the foundation of the whole underground market since they stimulate demand for all virtual goods and drive the market.

## 3.2 Market Interaction

In Figure 1, we provide an overview of the interaction of the individual actors within the underground market. The business between the six different actors within the ecosystem takes place in different locations. For example, businesses

between Envelopes Stealers, Virus Writers, and Website Masters/Crackers takes place in the underground black market on different kinds of bulletin board systems. These systems also provide a marketplace for Envelopes Stealers and Virtual Asset Stealers as well. On the other hand, the circulation of virtual assets is open on the World Wide Web. This is due to the fact that they need benign players to find them easily and there are very weak controls on the circulation of stolen virtual assets in China.

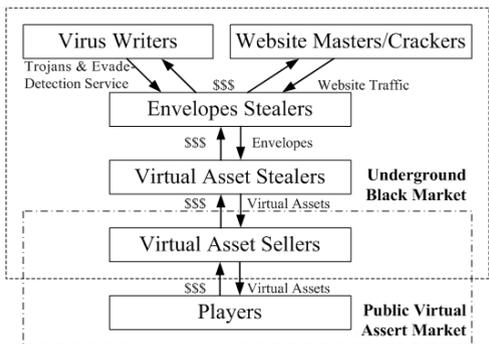


Figure 1. Interaction of the Individual Actors within the Underground Market on the Chinese Web

As noted previously, the underground market commonly uses bulletin board systems to connect the individual actors. One of the most prominent places for such markets within China is the Baidu Post Bar, the largest bulletin board community in China. Advertisements can be commonly found on several pertinent post bars at the site *post.baidu.com*. This system has a keyword-based structure, and there are no other entries to the post bar: if you do not know the keyword to search for, you will not find any malicious entries. The actors within the black market have their own, unique jargon, and thus it is hard for an outsider to find information about this threat.

The actual trading of virtual assets happens on public marketplaces like Taobao. These very common online business platforms within the WWW are used by the cyber criminals to advertise and sell their goods. After a trade was successful and a Player has bought a virtual good, the money is sent commonly via Alipay, the leading Chinese online payment service similar to PayPal. The goods, i.e., the virtual assets, are exchanged through different online mechanisms. They can for example be sent via e-mail or transferred with the help of other services within the Internet.

### 3.3 Case Study: PandaWorm

The most well-known security incident on the Chinese World Wide Web during the year 2007, which also follows the economy model we introduced above, was committed by a Chinese blackhat team. The most important actor is Li Jun, a Virus Writer. He implemented the *Panda worm* (also known as *Worm.Nimaya.w* or “panda burning joss stick”) based on his experience from implementing several other kinds of malware, for example *QQTailEKS* and *QQpass*, two popular pieces of malware. He sold Panda worm to more than 120 blackhats for a price between 500 and 1000 RMB. In December 2006, Li Jun met online with Wang Lei (a Website Master) and Zhang Sun (an Envelopes Stealer). Jun Li and Lei Wang set up several websites for hosting the Trojans that are automatically downloaded by users infected with the Panda worm. They sold the website traffic to Zhang Sun, who linked his web-based Trojans to the websites, thus the victims were infected with several Trojans that are able to steal virtual goods. The attackers stole the envelopes for online games from the infected machines. Zhang Sun sold the envelopes for a price between 0.9 and 2.5 RMB on the underground market.

The attackers lost control of Panda worm and this resulted in an infection of thousands of computers on the Internet in January and February 2007. The losses due to this incident are estimated to be up to 100 million RMB. This huge amount of damage raised the attention of several anti-virus vendors and the police: in February 2007, the criminals were arrested and put into jail. Before they were arrested, all of them made a certain profit: Li Jun made an estimated profit of about 150,000 RMB, Wang Lei 80,000, and Zhang Sun 12,000. In September 2007, Li Jun was sentenced to four years in prison, Wang Lei two and a half years, and Zhang Sun two years. Compared to other countries, the imprisonment for crime on the World Wide Web is high in China. For example, the author of Agobot, a bot that caused high damage, was sentenced by a German court for only 12 months on probation.

## 4 Mechanisms Behind Malicious Websites on the Chinese Web

### 4.1 Overall Technical Flow

The overall technical flow of the malicious websites phenomenon is shown in Figure 2. The Virus Writers take care of implementing web-based and conventional Trojans, and use evasion methods to create covert Trojans, and then they sell the malware and evasion service. Website Masters/Crackers betray their customers or crack unsafe websites, and sell the visitor’s traffic. Envelope Stealers construct a web-based Trojan network by hosting the bought web-based and

conventional Trojans on compromised computers, and redirect the website visitors to their web-based Trojans. When the web-based Trojan network is ready, the victims who visit the malicious websites will be redirected to and exploited by the web-based Trojans, and infected with further conventional Trojans. These Trojans then steal envelopes and virtual assets from the victim’s machine.

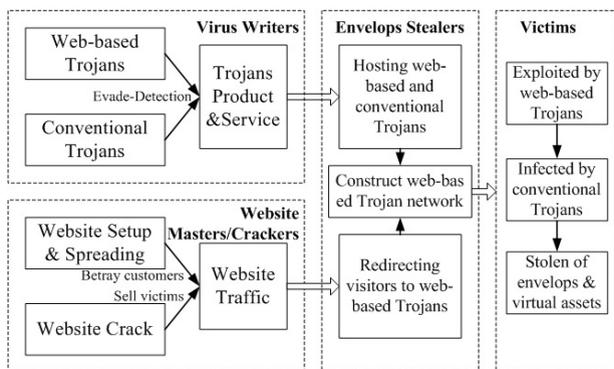


Figure 2. Overview of the Overall Technical Flow for the Malicious Websites Phenomenon

In the following subsections, we discuss in detail the mechanisms used by the Chinese attacker community in the different steps of this technical flow. We focus on the web-based and conventional Trojans, vulnerabilities used for web-based Trojans, and strategies for redirecting visitors to web-based Trojans.

## 4.2 Web-based and Conventional Trojans

There are two different types of Trojans involved in the technical flow of malicious website, i.e., Web-based Trojans and conventional Trojans. Web-based Trojans are used for exploiting the vulnerabilities in the web browser or third-party extensions and injecting the conventional Trojans. The purpose of conventional Trojans is to remotely control the victim’s machine and steal envelopes from them.

### 4.2.1 Web-based Trojans and Generators

Web-based Trojans are a kind of client-side attack, and typically exploit certain system- or application-level vulnerabilities to obtain complete control of the client system once the vulnerable client visits the malicious site. Web-based Trojans are typically implemented in scripting languages including JavaScript and PHP. Virus Writers commonly implement *generators* which can generate web-based Trojans

automatically and which can be used by other actors in the market without any programming skills.

In the following, we provide a brief example of a web-based Trojan. A well-known and widely used web-based Trojan family on the Chinese Web is the *MS06-014 Trojan*. The source code of the malware is quite easy to understand and it can be downloaded for free from the Internet, e.g., there are about 3,670 result pages by issuing the search request “MS06-014 Web-based Trojans” (in Chinese) to Baidu Search Engine, and about 2,800 pages by issuing “MS06-014 Generators” (in Chinese). Thus it became a primary web-based Trojan for the attacker community in China during the year 2006, and the exploited MS06-014 vulnerability was entitled the “King Vulnerability for Malicious Websites” accordingly.

To achieve a high exploitation rate, the Virus Writers are always seeking for zero day or newly disclosed vulnerabilities, and implement new web-based Trojans exploiting them. They are also targeting Chinese-specific applications and components including Baidu Soba BHO (Browser Help Object), Baofeng media player, PPStream network TV, Xunlei file download software, and others. Since these applications are also very widely installed and used by the Chinese Internet users, and lack an automatic patch update and delivery mechanism, they have become one of the most important targets of the web-based Trojans.

#### 4.2.2 Conventional Trojans

Conventional Trojans are also essential tools which contribute to the remote control of the infected “flesh chickens”, and the harvesting of stolen envelopes. The history of the conventional Trojans is quite long in the Chinese attacker community. The Virus Writers are constantly developing more powerful Trojans and they struggle against anti-virus vendors and their software.

The most famous and widely used full-functional Trojan after *Binghe* is the *Hack.Huigezi* tool, which was developed and maintained by a blackhat group called *Huigezi Lab*. Although *Huigezi* was advertised as a network management software, it contains many powerful functions that are beyond the demands of a network administrator, including remote control of a large amount of client computers to build botnets, downloading and uploading files, keystroke recording, remote desktop monitoring, setting up proxy servers, and hiding of itself by API hooking and process injection. Due to its powerful capacities and customized service provided by *Huigezi Lab*, *Huigezi* has been widely used by the Chinese blackhat community, also in the area of malicious websites. It was listed as a top ten malware for three years from 2004 to 2006 in a row by almost all of the Chinese anti-virus vendors.

There is also a large amount of dedicated stealer Trojans available on the Chinese Web or the underground market. Most of them are QQ stealers and online game stealers driven by the virtual asset market requirements. We could easily find free downloads or advertisements of up to ten different QQ stealer families

and stealer Trojans for almost all of the popular online games on the Chinese Web. Other types of Trojans, such as dedicated web-based bots for click fraud, stealers for online banking and stock trading credentials, are also seen on the Chinese public Web and the underground market.

### 4.3 Vulnerabilities Used for Web-based Trojans in China

Table 1 provides an overview of the number of published system- and application-level vulnerabilities used for web-based Trojans in China for the years 2003 until 2007. This table shows two major trends. First, malicious websites are more and more popular, and the number of disclosed and exploited vulnerabilities is increasing. Second, the attackers are moving to the vulnerabilities of common applications instead of system-level vulnerabilities.

Table 1. Number of System- and Application-level Vulnerabilities Related to the Malicious Websites Phenomenon for Several Years

Year	System Vulnerabilities	Application Vulnerabilities	Total
2003	1	0	1
2004	6	0	6
2005	5	0	5
2006	9	2	11
2007 (January – August)	8	7	15

In Table 2, we provide a more detailed overview of the vulnerabilities for the year 2007. We list the date of the public disclosure, the availability of a patch, and the availability of an exploit for this particular vulnerability. The table shows that the time between public disclosure and availability of a patch or exploit is often rather short: for a normal user, the *time to patch*, i.e., the time between the announcement of a vulnerability and the active exploitation in the wild, is rather short and it is hard to keep up with the latest information. Especially in the area of the Web, this is an increasing problem since patching third-party applications or browser add-ons / ActiveX controls is still a manual and error-prone process.

We also examined the relationship between vulnerabilities and their usage on the Chinese Web. The two left columns of Table 2 list for all vulnerabilities the date when an exploit was seen on a malicious website within the Chinese Web and when an exploit for this vulnerability was advertised on the underground black market. For all vulnerabilities we found information about the corresponding exploit available on the Chinese Web, and also most of the exploits were advertised on the underground market. This means that the attackers are very active and they also react fast to new vulnerabilities.

Table 2. Time between Public Disclosure, Patch Availability, and Exploit Availability for Selected Vulnerabilities on the Chinese Web in the Year 2007

The table also includes information when the first exploit was found on websites and when advertisements for exploits were found on the black market. N/A means that we did not find freely accessible information for patches or exploits.

Vulnerability ID	Disclosure	Patch	Exploit	Exploit on Websites	Advertisements
MS07-004	09.01.2007	09.01.2007	16.01.2007	26.01.2007	22.01.2007
MS07-009	24.10.2006	13.02.2007	26.03.2007	28.03.2007	N/A
MS07-017	28.03.2007	03.04.2007	08.04.2007	30.03.2007	10.04.2007
MS07-020	10.04.2007	10.04.2007	N/A	15.09.2007	24.07.2007
MS07-027	08.05.2007	08.05.2007	10.05.2007	30.03.2007	10.04.2007
MS07-033	14.03.2007	12.06.2007	14.03.2007	07.07.2007	13.06.2007
MS07-035	12.06.2007	12.06.2007	N/A	11.07.2007	08.07.2007
MS07-045	15.08.2007	14.08.2007	N/A	02.09.2007	02.09.2007
CVE-2007-3148	06.06.2007	N/A	06.06.2007	08.06.2007	N/A
CVE-2007-4105	02.08.2007	02.08.2007	03.10.2007	18.08.2007	23.09.2007
CVE-2007-4748	19.08.2007	N/A	31.08.2007	19.08.2007	08.09.2007
CVE-2007-4816	07.09.2007	20.09.2007	N/A	06.09.2007	08.09.2007
CVE-2007-5017	19.09.2007	N/A	19.09.2007	26.09.2007	N/A
CVE-2007-3296	30.05.2007	01.06.2007	N/A	25.06.2007	28.06.2007
CVE-2007-5064	30.08.2007	N/A	19.09.2007	30.08.2007	14.09.2007

#### 4.4 Strategies for Redirecting Visitors to Web-based Trojans

To redirect the visitors of the trojanized websites to the actual web-based Trojan, attackers are typically using one of the following three categories of strategies.

##### 4.4.1 Embedded HTML Tags

The first category uses embedded HTML tags such as *iframe*, *frame*, and others, to embed the web-based Trojan into the source code of the website. In order to achieve better covertness and flexibility, the attackers often introduce some intermediary stepping stones and dispatchers to build complex and obfuscated Trojan networks, by recursively using embedded tags and obfuscating the destination location.

The most used tag in the wild for redirection is *iframe*: the purpose of this HTML element is to create an inline frame that contains and displays another document. When the including page is opened, the included document is displayed

in the inline frame. The attackers take advantage of this characteristic to include the web-based Trojan directly or recursively, but always set the `iframe` to be invisible. This can be easily achieved by setting the height or width of the `iframe` to zero or a very small value.

The `frame` tag can also be used to include web-based Trojans, but it is a little bothering to define a frameset and include the URL to the web-based Trojan in an invisible frame, so it is rarely used by attackers in the wild. Other strategies belonging to this category include using the *body onload* event to load web-based Trojan, and injecting links to web-based Trojans into CSS and various other tags.

#### 4.4.2 Malicious Scripts

The second and also popular category uses the `script` tag to include web-based Trojan scripting or redirector scripting, which are often XSS (Cross-Site Scripting) vulnerabilities. The redirector scripting typically uses *document.write* to generate an *iframe* tag which includes the web-based Trojan or further stepping stones, or rarely seen *windows.open* function to obviously pop-up a new HTML window to perform exploitation.

#### 4.4.3 Embedded Objects

The third category of strategies for including a web-based Trojan is based on the embedded object tag for activating third-party applications (e.g., Flash or Baofeng media player) or Browser Helper Objects (BHOs) to display the embedded object. When vulnerabilities in these applications and BHOs are found, attackers then use this strategy to inject the carefully constructed objects to the vulnerable applications, which exploit them in order to remotely execute code on the victim's machine.

A classical example belonging to this category is a technique widely used by Chinese attackers during the last year to include web-based Trojans. This technique is based on an exploit of a vulnerability within Internet Explorer (MS06-021): the attackers can generate a malicious Flash file by injecting the URL to web-based Trojans into a normal, benign SWF Flash file, and then they can include this specially prepared Flash file in a website which they control or other well-known websites which provide the Flash uploading and browsing service. When the malicious Flash file is displayed by a vulnerable version of Internet Explorer, the visiting computers are then attacked and redirected to execute the web-based Trojans. The machine of the visitor is then compromised.

## 5 Measurements and Results

To understand the situation posed by the malicious websites phenomenon and the prevalence of the underground economy on the Chinese Web, we performed a comprehensive measurement study in October 2007. Our measurement setup covers the observation and analysis on the underground black market, the analysis on the public marketplace for the virtual assets trading, and a detailed and in-depth evaluation of the threats raised by malicious websites to the normal Chinese Internet users.

### 5.1 Measurements on the Underground Black Market

Unlike the US or European blackhat communities, Chinese blackhats are typically not familiar with IRC (*Internet Relay Chat*). They typically use bulletin board systems on the Web or IM software like QQ to communicate with each other. Orthogonal to a study on the underground black market located within IRC networks (Franklin et al. 2007), we measure the Chinese-specific underground black market on the Web. We focus on the most important part located at *post.baidu.com*, the largest bulletin board community in China. We crawled the portal and stored all posts and replies posted on certain post bars which are all dedicated for the underground black market on this particular website. The post bars we examined include *Traffic bar*, *Trojans bar*, *Web-based Trojans bar*, *Wangma bar* (acronyms of Web-based Trojans in Chinese), *Box bar*, *Huigezi bar*, *Trojanized websites bar*, and *Envelopes bar*.

Each post and reply in the bar contains a title, information about the poster, post time, and the actual content. If the poster is not registered, the poster field is filled with the Class C IP range from where the poster connects to the server. Although it is possible that one person connects to the server from different IP ranges, we can still use this information to represent the poster since this situation happens only rarely due to the lack of IP addresses in China. For each of the IP addresses, we queried the geographical location of the poster using *ChunZhen*, a well-known IP2Location library within the Chinese Internet community.

Our measurements show that 23,606 distinct posters were involved in the underground market between January 2006 and September 2007. In total, they posted 90,679 posts or replies during this period of time. As shown in Figure 3 and 4, the numbers of posts published on these post bars per month are increasing over time, as well as the numbers of posters. At the peak point in August 2007, almost 3,500 posters published nearly 14,000 posts on the underground market, which shows that the underground black market is quite active in China. We also provide an overview of the province distribution of the underground market

participants in Table 3, based on the location query results of the posters. This data is obtained with the help of a Geo-IP database.

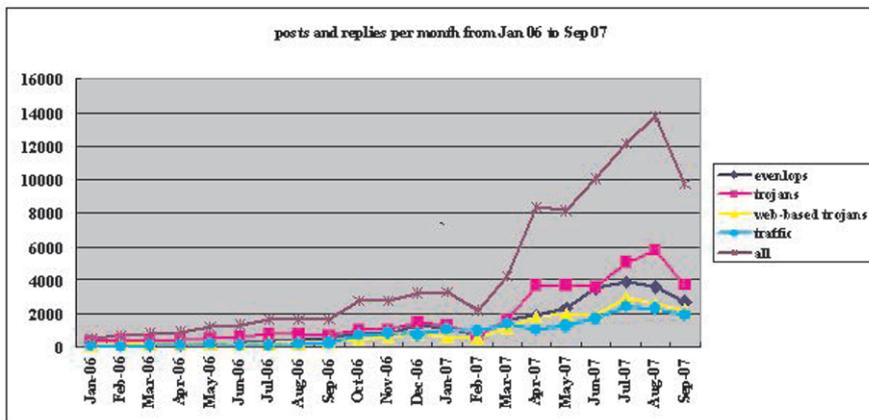


Figure 3. Posts and Replies per Month from January 2006 to September 2007

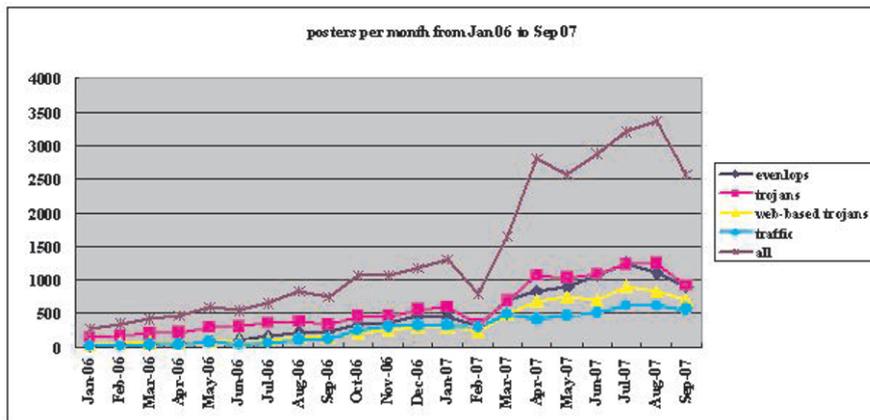


Figure 4. Posters per Month from January 2006 to September 2007

### 5.2 Measurements on the Public Virtual Assets Marketplace

We also studied the public assets marketplace visible via the Taobao online business platform. We found 42,561 online shops in total, and 34,450 of them had bargained deals successfully. Furthermore, our measurements show that there are a total of 1,220,181 virtual goods in all of these shops available, which means that each shop has on average 28 goods.

To estimate the market value of the whole virtual asset exchange market on the Taobao platform, we crawled the credit history pages of all the shops. From these pages it is possible to retrieve more information about the overall trading activity during different periods, including in the last week, the last month, the last six months, and the whole lifetime of the online shop. Furthermore, this page also contains the geographical location of the shop owner. Based on this information, we calculated that there were a total of 8,907,568 successful deals within the last six months. We also examined all of the successful deals in one typical shop to estimate the value per deal, which resulted in an average total price of 12.56 RMB. Based on these values, we can estimate that the market value of the virtual asset exchange is about 223 million RMB in total on the Taobao platform. Taking into account that the virtual asset exchange can also take place on PaiPai, eBay, and thousands of smaller, but dedicated online markets and shops, we conclude that there is a prospering virtual asset industry. These numbers also explain why the underground market is so attractive for malicious attackers, especially since the legal situation in China does not take cyber crime related to stealing of virtual assets into account.

### 5.3 *Malicious Websites on the Chinese Web*

In this work, we are not only interested in finding malicious websites and analyzing them in-depth, but also in gaining an overall understanding about how much this phenomenon threatens the normal Chinese Internet users. We thus want to examine the WWW in China and try to gain a better understanding of the malicious “corners” within the Web. In the following paragraphs, we describe our measurement setup and present the results of our measurement study.

#### 5.3.1 **Measurement Setup**

According to the status report published by China Internet Network Information Center (CNNIC), there are a total of 1.31 million websites on the Chinese WWW in June 2007 (CNNIC 2007). Since checking the whole content of the Chinese Web is infeasible due to the size of the Web, we need to find a way to efficiently inspect a representative part of it. We thus need a good *sampling strategy* in order to find the parts of the Web that are most commonly accessed by normal Internet users. According to the same report by CNNIC, about 75% percent of the Internet users within China use search engines to find their information and target websites on the WWW. To sample the Chinese WWW effectively and focus on the major threats to the majority of Chinese Internet users, we thus use search engines to find the starting points of our experiments. We used two input sources to obtain the most commonly used keywords by Chinese Internet users to find their information: first, we used the Baidu top search keywords list provided at

<http://top.baidu.com>. Second, we included the Google Chinese ReBang (“Top hot search keywords”) provided at <http://www.google.cn/rebang/home>. Using the combined list of both inputs, we then categorized the searched websites into the following twelve categories: *portal/navigation*, *movie/TV*, *game*, *news/information*, *sport/entertainment*, *free download*, *e-business*, *industry information*, *chat/virtual society*, *e-finance*, *warez*, and *user content*. By issuing the most commonly used keywords for the specific content area to the Baidu and Google search engines, we obtained about 145,000 domain names. This set of sites represents our sampling set. Furthermore, we built a blacklist category containing the recently reported malicious websites by the Chinese Internet community during a one-week period before our measurements. We inspected all these websites to examine whether they are malicious or not. We also categorized the websites to learn whether there are some specific areas on the Chinese WWW that are more risky than others.

To actually inspect these websites, we developed a client honeypot that is capable of efficiently examining whether or not a given website is malicious. In contrast to previous work in this area, we split the task in two steps: in the first step, we examine websites with a *high-interaction honeypot*. A honeypot is a system which is intended to be probed, accessed, or compromised (Provos and Holz 2007). In this context high-interaction means that we use a real system for performing the analysis: The basic idea is to execute a web browser within a *honeypot* environment, automatically “surf” websites, and closely observe all activities on the honeypot. If we open a web page within the honeypot and this website exploits a vulnerability in our browser, we can detect this malicious behavior and issue an alert. In a second step, we use a *low-interaction honeypot*: instead of using a real system, we use a web crawler to automatically download and analyze larger amounts of data. As a starting point for these crawls, we use malicious websites identified in the first step. This two-tier architecture helps us to scale the system and analyze content in more depth. More technical details about the setup are available in the extended version of this chapter.

### 5.3.2 Malicious Websites

Based on the measurement setup we introduced in the former subsection, we identified a total of 2,149 malicious websites from 144,587 distinct hosts which represent the most commonly visited websites by normal Chinese Internet users. Table 3 provides an overview of the measurement results for the twelve different categories, the blacklist, and the total sites. We found that the categories including free download, sport/entertainment, movie/TV and chat/virtual society are more risky than others, which is consistent with our anticipation. The results also reveal that all categories contain a significant amount of malicious content: this is an important discovery as it means any Chinese Internet user accessing the web is at risk, regardless of the type of content they browse. Given the fact that all these sites were found using a search engine, this proves that the threat is significant.

Table 3. Measurement Results for Malicious Websites on the Chinese Web

Category	Keywords	Inspected	Malicious	%
Free Download	22	20,547	394	1.92
Sport / Entertainment	31	27,649	520	1.88
Movie / TV	25	23,472	423	1.84
Chat / Virtual Society	6	8,115	140	1.73
Game	23	20,105	269	1.34
News / Information	29	36,700	459	1.25
Warez	14	13,237	164	1.24
Portal / Navigation	6	8,829	106	1.20
Industry Info	17	20,518	246	1.20
e-Finance	15	19,138	139	0.73
e-Business	6	9,799	64	0.65
User Content	6	7,402	33	0.45
Total with overlaps	200	215,511	2,965	1.38
Distinct Total	200	144,587	2,149	1.49
Blacklist	N/A	796	28	3.52

The measurement results for the different categories reveal that different parts of the Web have a different degree of maliciousness: we found that user content is only malicious in 0.45% of the sites, while free download sites have a significant higher chance of hosting malicious content.

### 5.3.3 Link Analysis

Based on the collected data, we can also generate interrelations between different malicious websites. This allows us to connect different attacks and we can learn more about relations between the involved domains. We have generated several graphs revealing the link relations between the involved domains, redirectors, and the hosts of the web-based Trojans discovered during our measurement. In Figure 5, we show an example of such a graph, in which we see that different domains are connected via malicious content included as an embedded link.

Trojanized websites are drawn as ellipses, the redirector websites are drawn as parallelograms, and the exploit-hosting websites are drawn as boxes.

Similar to the node ranking strategy adopted by HoneyMonkey (Wang et al. 2006), we also assign the incoming and outgoing ranks to all of the hosts in the overall graph. We focus on the top-level domain names and not the low-level redirection links. Our strategy can reflect the popularity of the exploiters more precisely than the graphs generated by HoneyMonkey. Ordered by the incoming

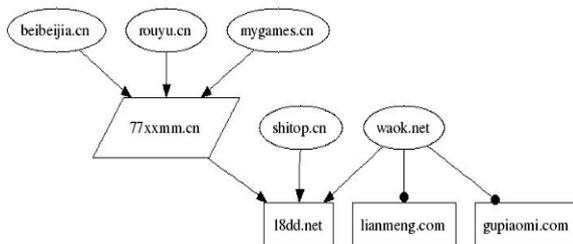


Figure 5. Example of Link Analysis of Malicious Websites

ranks, we were able to list the top malicious sites, together with the number of directly linked malicious websites or redirectors. Shutting down these domains would effectively lower the total amount of malicious websites on the Chinese Web since these domains are one of the root causes.

We also analyzed the top exploiter in more depth, and found out that 490 malicious websites (22.8% of total) located at 206 different top domains redirected their traffic to this particular attacker. The links were either direct or via 26 redirectors. The attacker used heavily obfuscated hosted dispatcher scripts and web-based Trojans to evade detection. In total, we found 21 different executables being used in this attack, and the majority of them are identified as online game stealers.

An interesting observation we can find from the link analysis is that the attackers register large amounts of *.cn* domains and use them for their attacks. This is specific to the Chinese Web since starting in March 2007, the register fee for *.cn* domains is only 1 RMB for the first year to encourage the development of the Chinese Web. Attackers abuse this in order to have many domains which redirect innocent Internet users to malicious websites. To even enhance the effectiveness of this strategy, the attackers generate many second-level domain names on these cheap domains. The domain names themselves seem to be generated in a random fashion and follow no obvious pattern.

## 6 Conclusions

In this chapter, we studied several aspects of malicious activities within the World Wide Web. First, we introduced a model of the underground black market which describes the interaction of the different actors within the market. This model is based on empirical data collected within China. Based on this model, we presented the first empirical measurements of malicious websites within the Chinese part of the World Wide Web. We studied the activities of attackers, how they trade the virtual goods (e.g., exploits or envelopes), and where they are located. Furthermore, we also examined malicious content within the Chinese Web. We combine

high- and low-interaction honeypots to study whether or not a given site contains malicious content.

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