



# Malware

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## Botnets

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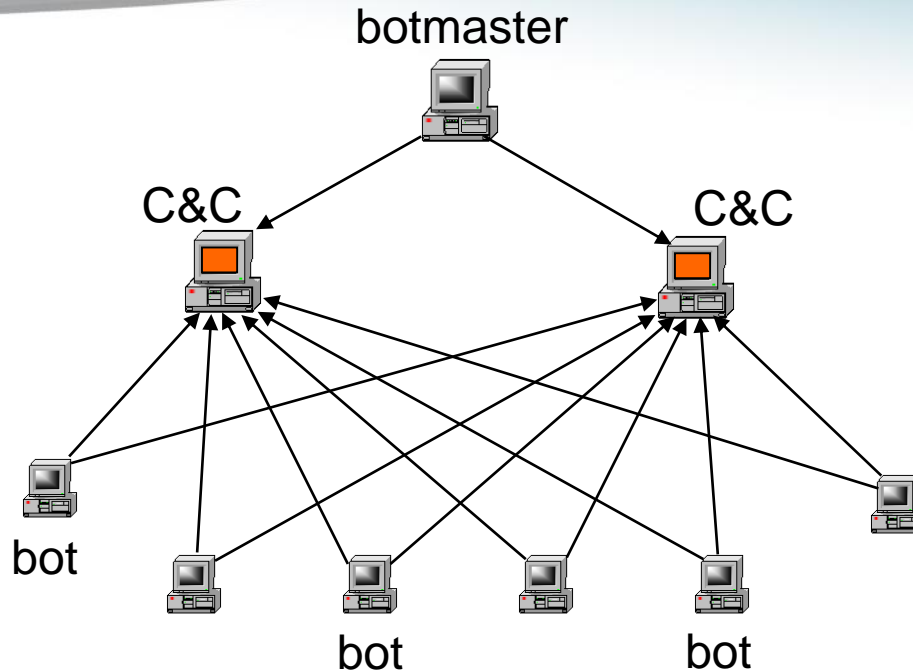


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# What Is a Botnet?

- Botnet: bot + network
  - Bot: compromised machine installed with remote controlled code
  - Networked bots under a single commander (botmaster, botherder)
- Botnet is the major threat nowadays
  - Large-scale worm attacks are old news
  - Profit: motivation for most attackers
    - Spam, phishing, ID theft, DoS blackmail
    - Botmaster with thousands of machines at command has attack power

# Current Botnet Command & Control Architecture



- Bot periodically connects to one/some of C&C servers to obtain command
  - Hard-coded IPs or DNS names of C2 servers
- C&C: usually Internet Relay Chat (IRC) based

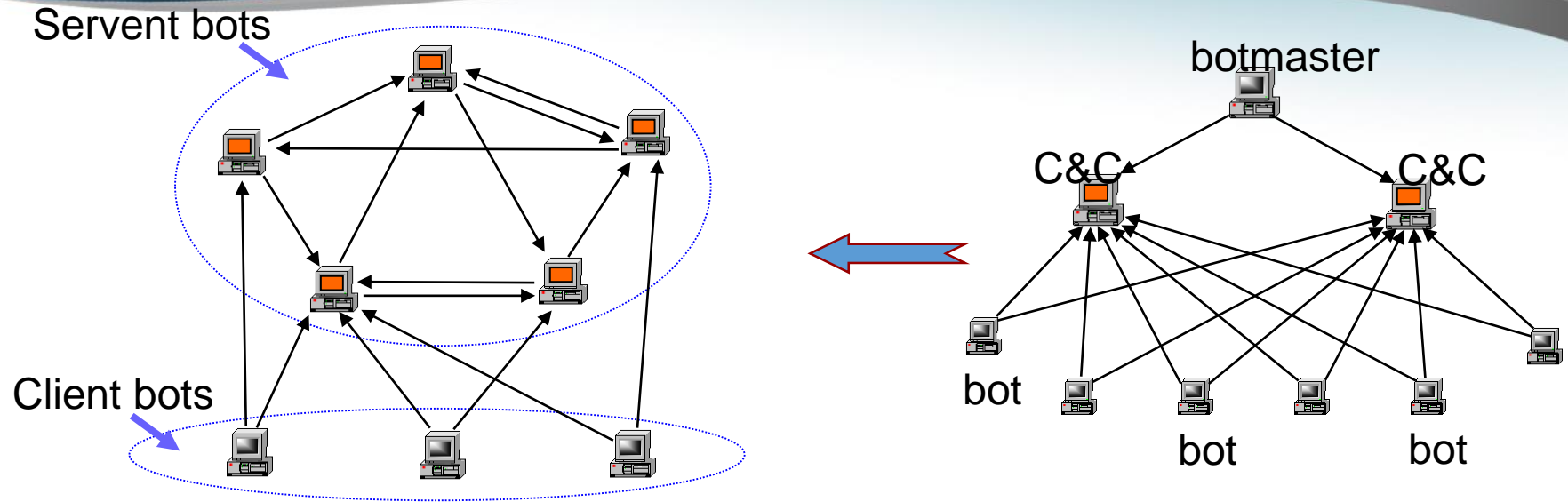
# Three Possible types of Botnets

- Peer-to-peer structured botnets
  - More robust C2 architecture
  - We present a hybrid P2P botnet
- Honeypot-aware botnets
  - Honeypot is popular in malware defense
  - A general principle to remove inside honeypot spies
- Stealthy botnets
  - Keep bots as long as possible
  - We study “rootkit” techniques

# Peer-to-Peer (P2P) based Control Architecture

- Weakness of C&C botnets
  - A captured bot (e.g., honeypot) could reveal all C2 servers
  - The few C2 servers can be shut down at the same time
  - A captured/hijacked C2 server could reveal all members of the botnet
- C&C centralized → P2P control is a natural evolution
  - P2P-based network is believed to be much harder to shut down

# Hybrid P2P Botnet



- Bots: static IPs, able to receive incoming connections
  - Static IP ensures a stable, long lifetime control topology
- Each bot connects to its “peer list”
  - Only servent bot IPs are in peer lists

# Botnet Monitor by Botmaster

- Botmasters know their weapons
  - Botnet size
  - bot IPs, types (e.g., DHCP ones used for spam)
  - Distribution, bandwidth, diurnal ...
- Monitor via *dynamical* sensor
  - Sensor IP given in a monitor command
  - *One sensor, one shot, then destroy it*
    - Use a sensor's current service to blend incoming bot traffic

# P2P Botnet Construction

- Botnet networked by peer list
- Basic procedures
  - New infection: pass on peer list
  - Reinfection: mix two peer lists
    - Ensure balanced connectivity
- Remove the normal P2P bootstrap
  - Or, increase entries in bootstrap as botnet grows

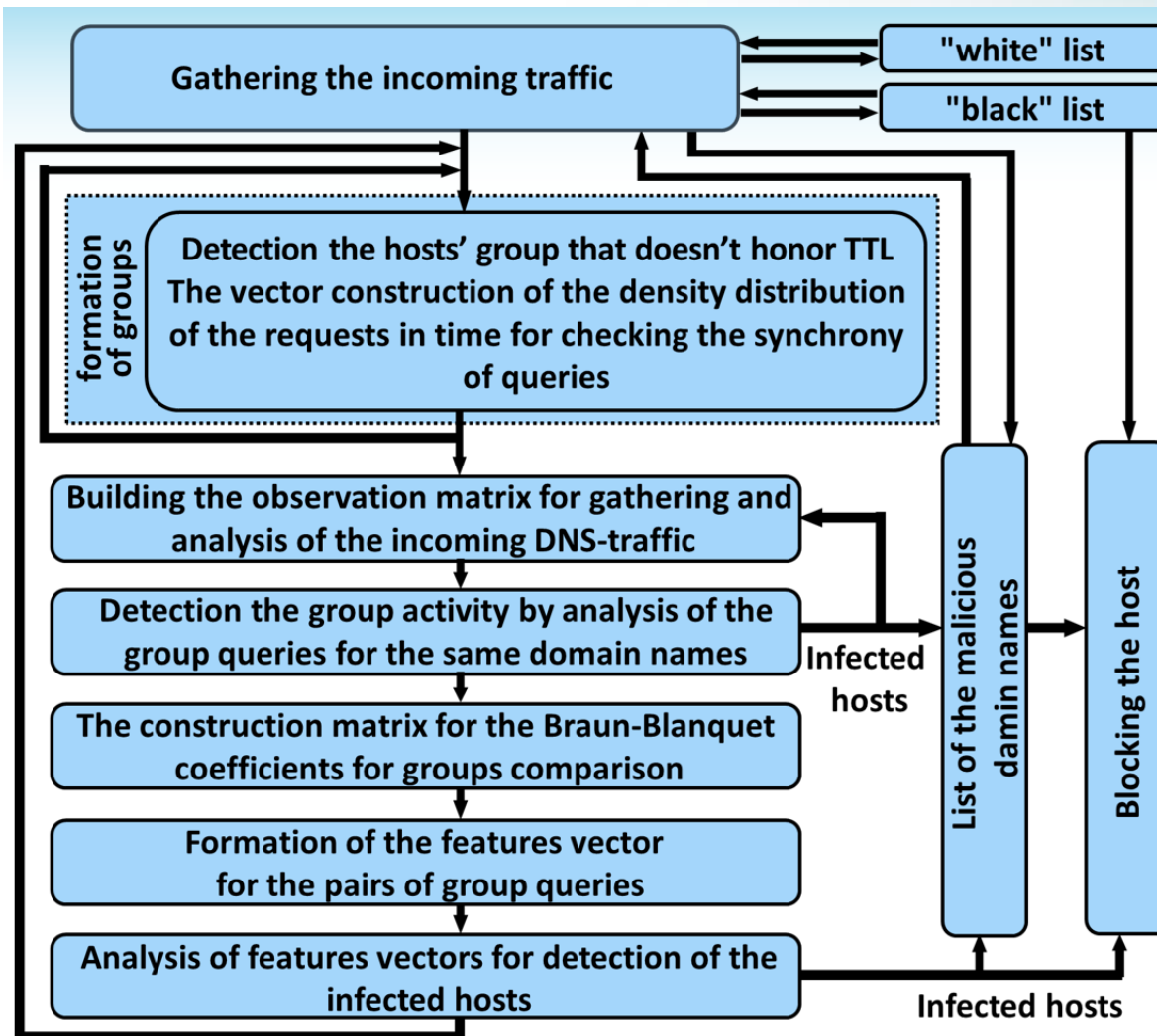


# P2P Botnet Construction

- Peer-list updating procedure
  - Obtain current bots information
  - Request every bot connect to a sensor to obtain a new peer list
- Result: all bots have balanced connectivity to bots used in this procedure
  - Use once is enough for a robust botnet
  - Can be used to reconnect a broken botnet

# A scheme of the botnet detection

## Passive monitoring

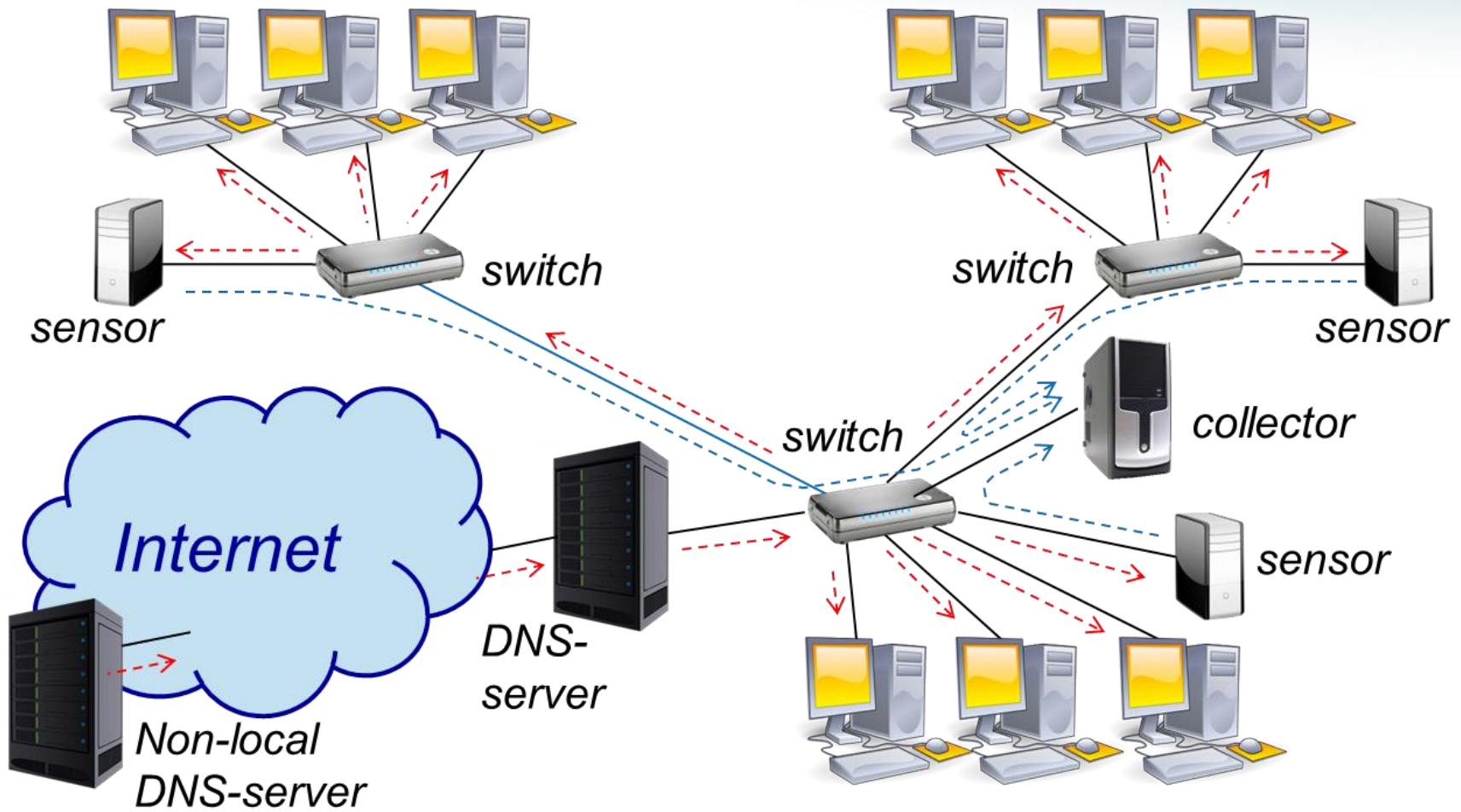


The method takes into account abnormal behaviors of the hosts' group, which are similar to botnets' behavior:

- hosts' group does not honor DNS TTL (flush local DNS-cache)
- carry out repeated queries for domain names before TTL expiration
- implement the DNS-queries to non-local DNS-servers

# Botnet Detection Process

## Gathering the incoming traffic



# Botnet Detection Process

## Detection the hosts' group that does not honor TTL

If hosts' group is flushing the local hosts DNS-caches it means that the hosts' group does not honor TTL. In order to detect that fact the observation matrix is built.

Each row contains the hosts' MAC-addresses that requested the specific domain name during the TTL (so they possibly carry out a group activity)

### Observation matrix $V_{MAC}$

MAC-addresses

	$H_1$	$H_2$	$H_3$	$H_4$	...	$H_j$
request to the specific domain name $d_i$ →	1	1	1	1	...	1
repeated request →	1	0	1	1	...	0

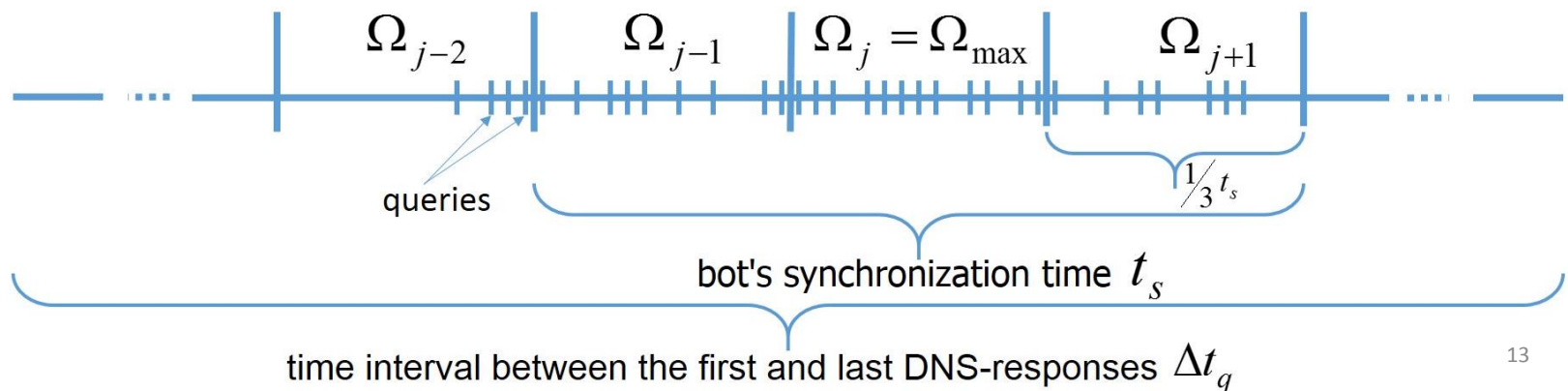
# Botnet Detection Process

## The vector construction of the density distribution of the requests in time for **checking the synchrony of queries**

We will consider the group of queries as synchronous if we observe the greatest number of queries for the domain name during the time when the bots of the botnet are performing queries - bot's synchronization time  $t_s$ . In order to check the synchrony of queries of the DNS-queries we divide the interval between the first and last DNS-responses  $\Delta t_q$  is into  $z$  intervals:

$$z = (t_{last} - t_{first}) / \frac{1}{3} t_s,$$

where  $t_{last}$  and  $t_{first}$  - time of the last and first DNS-responses for domain name  $d_i$  within the TTL, during which the group activity is searching or the group flushing of local DNS-caches is fixed.

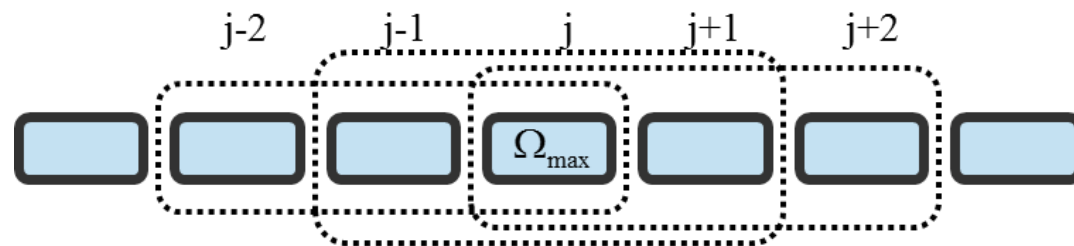


# Botnet Detection Process

## The vector construction of the density distribution of the requests in time for **checking the synchrony of queries**

For group query we build the vector of density distribution of z-elements for queries in time  $\overline{W}_{d_i} = (\Omega)_{j=1}^z$ , where  $\Omega_j$  – number of queries within the z-th interval.

For the element of vector  $\overline{W}_{d_i}$  with a maximum value  $\Omega_{\max}$  within  $j = \max \pm 2$ , we find two adjacent elements with the largest values so that all three elements could describe the query distribution of continuous interval, and then we calculate their sum ( $\text{Sum}_s$ ). If  $(1 - \delta) \cdot \text{Sum}_s > \text{Sum}_r$ , then the group query is the subject to further analysis, otherwise such group is discarded, where  $\text{Sum}_r$  - the sum of other vector elements  $\overline{W}_{d_i}$



If queries are synchronous, the sets of MAC-addresses in the matrix  $V_{\text{MAC}}$  hosts groups are combined.

# Botnet Detection Process

## Building the **observation matrix $M_k$** for analysis the incoming DNS-traffic

MAC-addresses of hosts' groups  
received from the matrix  $V_{MAC}$

number of hosts in the group

sign of repeated request within TTL-period

query to local/non-local DNS-servers

hosts' group is "infected" or "suspicious"

NXDOMAIN error code in DNS-responses

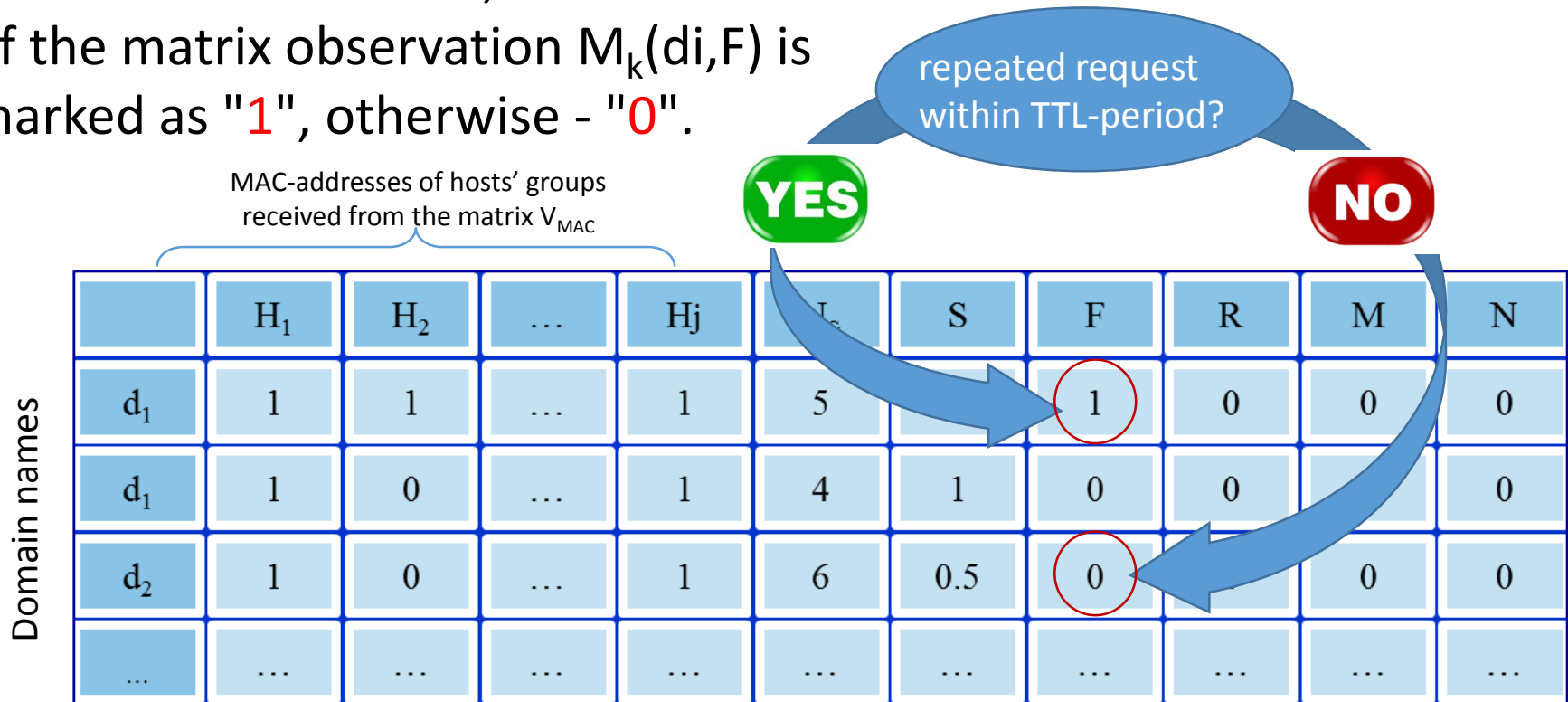
number of iteration with the "suspicious" sign

	$H_1$	$H_2$	...	$H_j$	$N_G$	S	F	R	M	N
$d_1$	1	1	...	1	5	1	1	0	0	0
$d_1$	1	0	...	1	4	1	0	0	0	0
$d_2$	1	0	...	1	6	0.5	0	0	0	0
...	...	...	...	...	...	...	...	...	...	...

# Botnet Detection Process

## Building the **observation matrix** for analysis the incoming DNS-traffic

If the repeated requests within TTL-period were observed, then the cell of the matrix observation  $M_k(d_i, F)$  is marked as "1", otherwise - "0".





# Botnet Detection Process

## Building the **observation matrix $M_k$** for analysis the incoming DNS-traffic

If the hosts' group have been requesting the domain name  $d_i$  to a **local** and **other DNS-servers**, then the cell of observation matrix  $M_k(d_i, S)$  is marked as "0", if **only** to the **local DNS-server** - "**0.5**", if only to a **non-local DNS-servers** - "**1**".

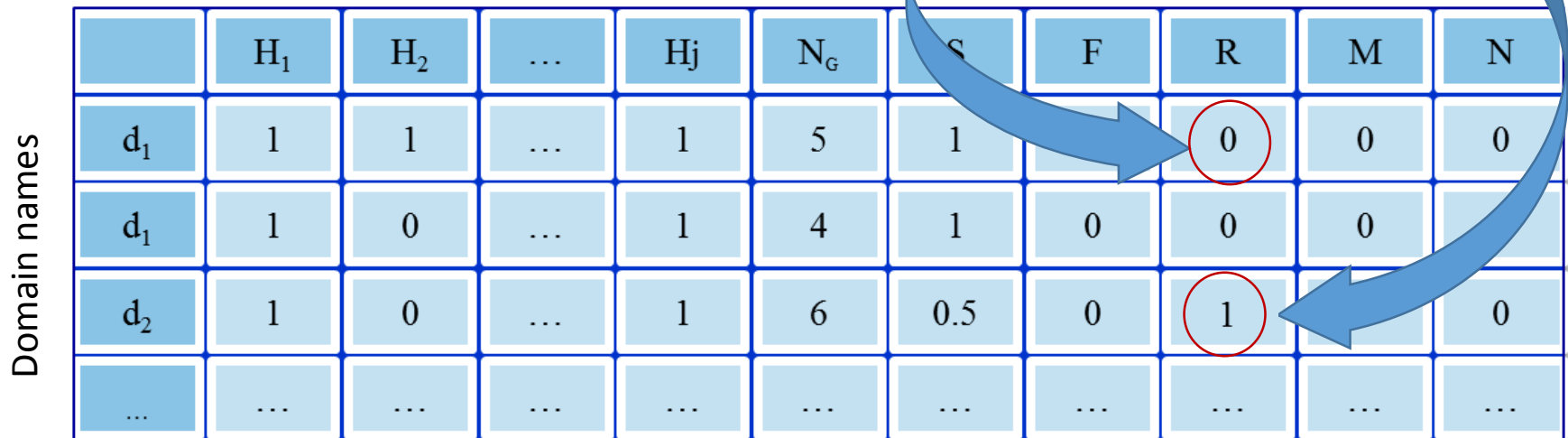
	$H_1$	$H_2$	...	$H_j$	$N_G$	S	F	R	M	N
$d_1$	1	1	...	1	5	1	0	0	0	0
$d_1$	1	0	...	1	4	0	0	0	0	0
$d_2$	1	0	...	1	6	0.5	0	0	0	0
...	...	...	...	...	...	...	...	...	...	...

# Botnet Detection Process

## Building the **observation matrix $M_k$** for analysis the incoming DNS-traffic

If the DNS-responses for this group contain NXDOMAIN error code, then the cell of observation matrix  $M_k(d_i, R)$  is marked as "1", otherwise - "0".

The cell  $M_k(d_i, F)$  will be filled at a next stage



# Botnet Detection Process

## The similarity evaluation of hosts' groups

Comparison of the *two groups* of hosts  $G_1$  and  $G_2$ , that sent the DNS-queries for two domain names  $d1$  and  $d2$  at time intervals  $\Delta t_1$  and  $\Delta t_2$  respectively, using the Braun-Blanquet coefficient:

$$K_B(G_1, G_2) = \frac{N_o}{\max[N_{G_1}, N_{G_2}]},$$

where  $N_o$  - the number of common elements in groups  $G_1$  and  $G_2$ ;  $N_{G_1}$  and  $N_{G_2}$  - the number of hosts in groups  $G_1$  and  $G_2$ , respectively,  $K_B(G_1, G_2) \in [0, 1]$ .

If the number of compared groups is *more than two* the Koch index of dispersity is used:

$$K_K(G_1, \dots, G_q) = \frac{C - A}{(q - 1) \cdot A}$$

where  $G_1, \dots, G_q$  - comparable groups of hosts;  $q$  - the number of comparable groups;  $C = \sum_{i=1}^q N_{G_i}$  - total number of MAC-address in all groups;  $A$  - number of different MAC-addresses presented in groups;  $K_K(G_1, \dots, G_q) \in [0, 1]$ .

# Botnet Detection Process

## Detection the group activity by analysis of the group queries for the same domain names

Detection the groups' queries is made by comparison the groups by MAC-adresses.

**Braun-Blanquet** coefficient to compare **two** groups or **dispersion index Koch** for **3 or more** groups.

If the result of comparison exceeds the threshold  $K_B \geq \delta$  or  $K_K \geq \delta$ , the hosts' group is considered as **infected**, if  $\delta \leq K_B < \delta$  or  $\delta \leq K_K < \delta$  the hosts' group is considered as **suspicious**

	H <sub>1</sub>	H <sub>2</sub>	...	H <sub>j</sub>	N <sub>G</sub>	S	F	R	M	N	
d <sub>1</sub>	1	1	...	1	5	1	1	0	0	0	group 1.1 group 1.2 group 1.3
d <sub>1</sub>	1	0	...	1	4	1	0	0	0	0	
d <sub>2</sub>	1	0	...	1	6	0.5	0	0	0	0	
d <sub>1</sub>	1	1	...	1	5	1	1	0	0	0	group 4.1 group 4.2
d <sub>3</sub>	1	1	...	1	4	0	0	1	0	0	
d <sub>4</sub>	1	1	...	1	5	0	0	0	0	0	the Koch index of dispersity
d <sub>4</sub>	1	1	...	1	7	0	0	0	0	0	
d <sub>5</sub>	1	1	...	1	4	0	0	0	0	0	the Braun-Blanquet coefficient

# Botnet Detection Process

An additional analysis of the observation matrix  $M_k$  when group queries do not honor TTL and use non-local DNS-servers

If result of the comparison

$$\delta' \leq K_b < \delta \text{ or } \delta' \leq K_k < \delta$$

If **any** of group queries do not honor TTL

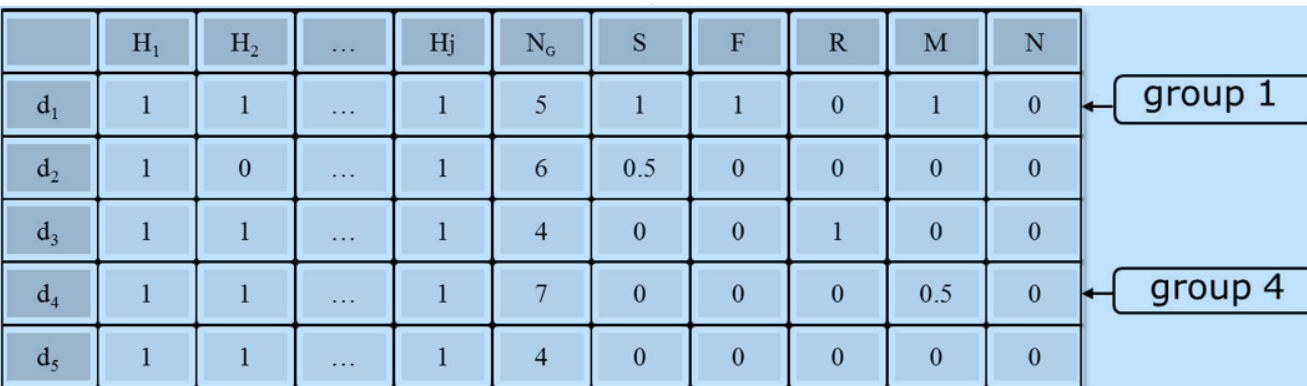
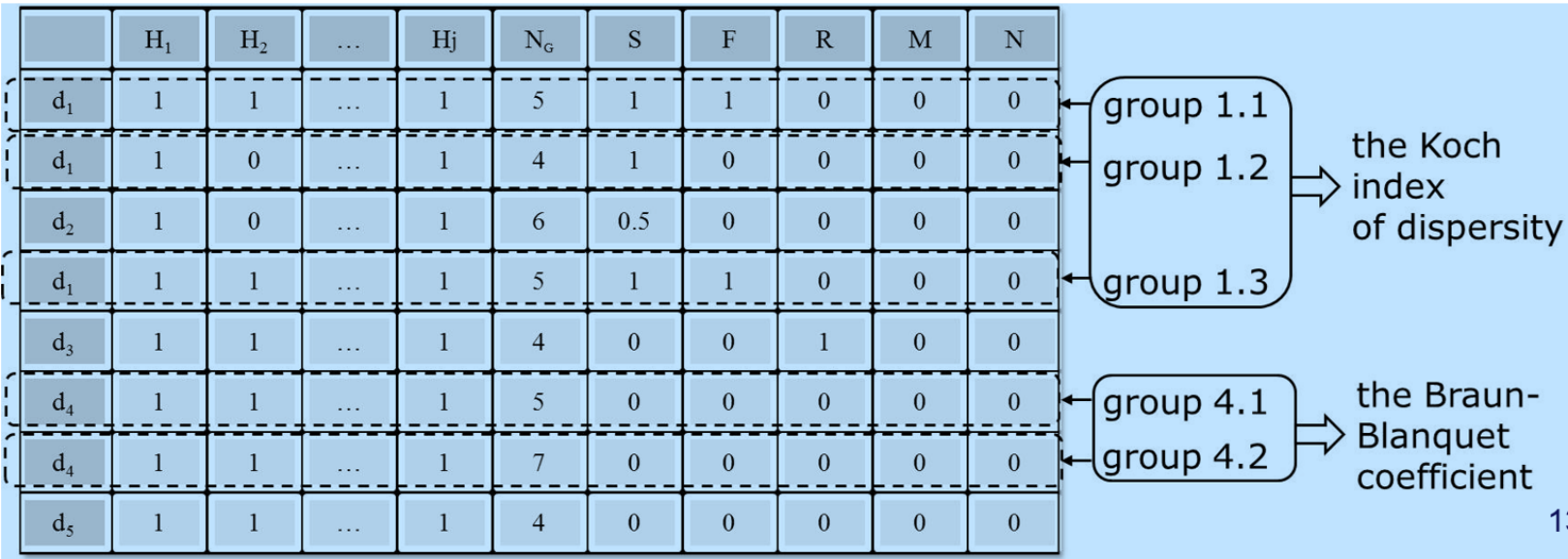
$$M_k(di, F)=1$$

If **all** queries to non-local DNS-servers were observed

$$M_k(di, S)=1$$

hosts' group is considered as **infected**

# Botnet Detection Process

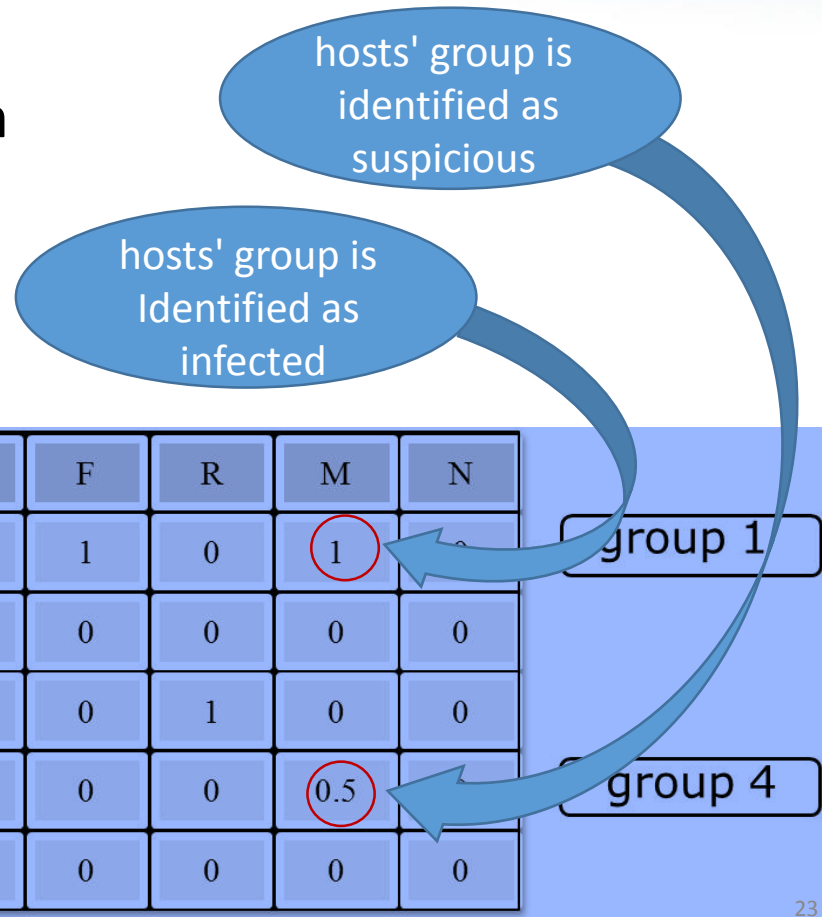


If groups are defined as **infected** or **suspicious**, we combine the set of MAC-addresses into one row for the domain name **d** in the matrix **M<sub>k</sub>**

# Botnet Detection Process

## Further filling of the **observation matrix** $M_k$

If the hosts' group is identified as **infected** the cell of the observation matrix  $M_k(d;M)$  is marked as "1", and as "0.5" - if it was defined as **suspicious**.



	$H_1$	$H_2$	...	$H_j$	$N_G$	S	F	R	M	N	
Domain names	$d_1$	1	1	...	1	5	1	1	0	1	...
$d_2$	1	0	...	1	6	0.5	0	0	0	0	...
$d_3$	1	1	...	1	4	0	0	1	0	0	...
$d_4$	1	1	...	1	7	0	0	0	0.5	...	...
$d_5$	1	1	...	1	4	0	0	0	0	0	...

# Botnet Detection Process

## The construction of the lower triangular matrix for the Braun-Blanquet coefficients

We built *the lower triangular matrix* for the Braun-Blanquet coefficients  $B_k$ . The rows of the matrix  $B_k$  are formed by **increasing** number of MAC-addresses in groups  $N_G$ . The Braun-Blanquet coefficients are filled in the matrix, which were calculated for pairs of hosts' groups. Calculation of the values for the column cells is terminated if  $N_{G_i} / N_{G_{i+1}} < \delta'$ .

the lower triangular matrix for the Braun-Blanquet coefficients

	$d_3$	$d_5$	$d_1$	$d_2$	$d_4$	...	$N_G$	S	F	R	M	N
$d_3$	1					...	4	0	0	1	0	0
$d_5$	1	1				...	4	0	0	0	0	0
$d_1$	0.8	0.8	1			...	5	1	1	0	1	0
$d_2$			0.5	1		...	6	0.5	0	0	0	0
$d_4$			0.71	0.43	1	...	7	0	0	0	0.5	0



# Botnet Detection Process

## Formation of the features vector for the pairs of group queries

For each pair of group queries when  $K_B \geq \delta$  from the matrix  $B_k$  we form the features vector  $\overline{W_{G_1, G_2}}$ , which can be defined

$$\overline{W_{G_1, G_2}} = \left( K_B(G_1, G_2), S_{G_1, G_2}, F_{G_1, G_2}, R_{G_1, G_2}, M_{G_1, G_2} \right),$$

where  $S_{G_1, G_2}, F_{G_1, G_2}, R_{G_1, G_2}, M_{G_1, G_2}$  - behavioral features for two compared groups

Combined behavioral features for two compared groups, obtained from the matrix  $B_k$

# Botnet Detection Process

## Definition of the combined behavioral features

**Behavioral feature for:**  
the sign of query  
to local/non-local  
DNS-servers

$$S_{G_1, G_2} = \begin{cases} \text{Unusual, if } B_k(d_1, S) = B_k(d_2, S) = 0, \\ \text{Neutral, if } B_k(d_1, S) = B_k(d_2, S) = 0.5, \\ \text{Dangerous, if } B_k(d_1, S) = B_k(d_2, S) = 1, \\ \text{Suspicious otherwise.} \end{cases}$$

**Behavioral feature for:**  
the sign of the hosts'  
group "infected" or  
"suspicious", obtained  
at intermediate stages  
of analysis

$$M_{G_1, G_2} = \begin{cases} \text{Neutral, if } B_k(d_1, M) = B_k(d_2, M) = 0, \\ \text{Suspicious, if } ((B_k(d_1, M) = 0.5 \vee B_k(d_2, M) = 0.5) \wedge \\ \wedge B_k(d_1, M) \neq 1 \wedge B_k(d_2, M) \neq 1) \wedge B_k(d_1, M) \neq B_k(d_2, M), \\ \text{Dangerous, if } B_k(d_1, M) = 1 \vee B_k(d_2, M) = 1 \vee \\ \vee (B_k(d_1, M) = B_k(d_2, M) = 0.5 \wedge B_k(d_1, N) \neq B_k(d_2, N) \vee \\ \vee B_k(d_1, N) = B_k(d_2, N) = 0), \end{cases}$$

**Behavioral feature for:**  
the sign of repeated request  
Within TTL-period

$$F_{G_1, G_2} = \begin{cases} \text{Neutral, if } B_k(d_1, F) = B_k(d_2, F) = 0, \\ \text{Suspicious, if } B_k(d_1, F) \neq B_k(d_2, F), \\ \text{Dangerous, if } B_k(d_1, F) = B_k(d_2, F) = 1. \end{cases}$$

# Botnet Detection Process

## Formation of the features vector for the pairs of group queries

	$d_3$	$d_5$	$d_1$	$d_2$	$d_4$	...	$N_G$	S	F	R	M	N
$d_3$	1					...	4	0	0	1	0	0
$d_5$	1	1				...	4	0	0	0	0	0
$d_1$	0.8	0.8	1			...	5	1	1	0	1	0
$d_2$			0.5	1		...	6	0.5	0	0	0	0
$d_4$			0.71	0.43	1	...	7	0	0	0	0.5	0

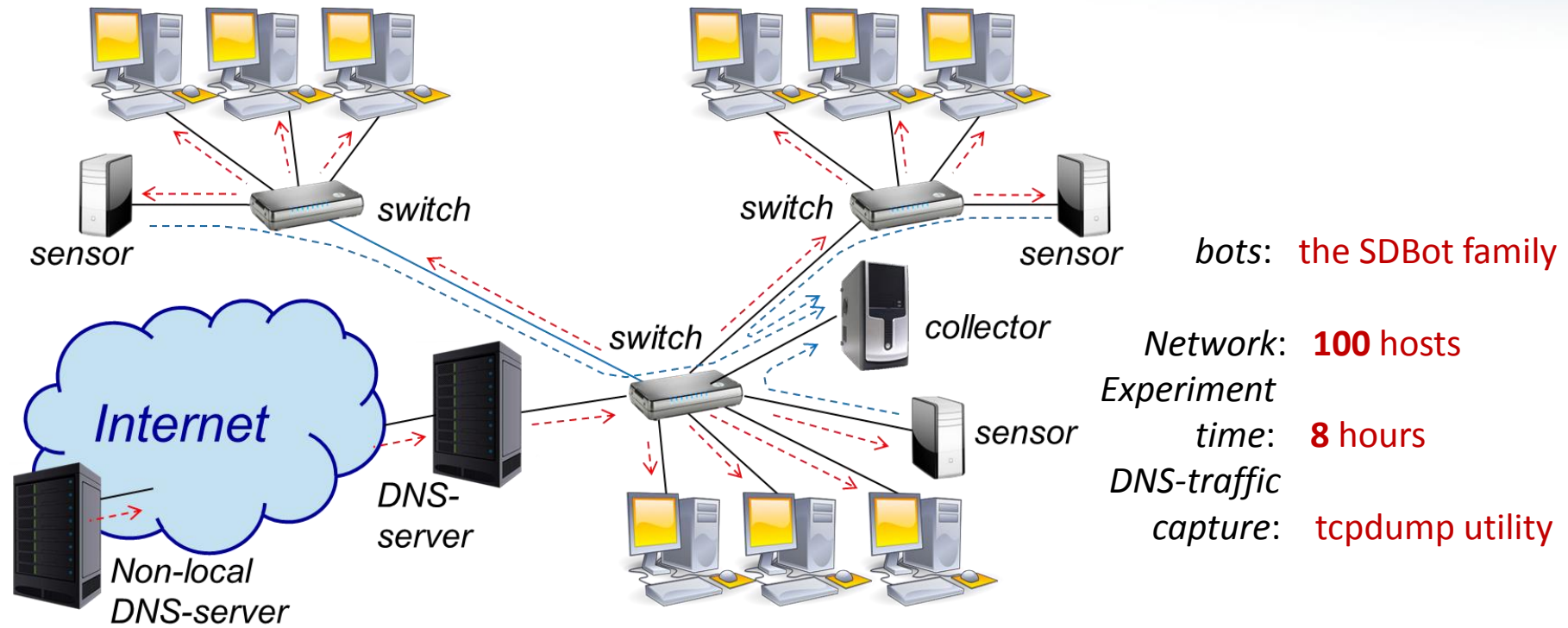
$K_b(G_1, G_4)$	$S_{G_1, G_4}$	$F_{G_1, G_4}$	$R_{G_1, G_4}$	$M_{G_1, G_4}$
0.71	Suspicious	Suspicious	Neutral	Dangerous

Analysis of the features vectors is performed by the following rules:

$$f(\overline{W_{G_1, G_2}}) = \begin{cases} \text{Not\_Infected, if } K_B(G_1, G_2) < \delta \wedge S_{G_1, G_2} = \text{Unusual} \wedge \forall \overline{W_{G_1, G_2}}(j) \neq \text{Suspicious} \wedge \forall \overline{W_{G_1, G_2}}(j) \neq \text{Dangerous,} \\ \text{Not\_Suspicious, if } K_B(G_1, G_2) < \delta \wedge S_{G_1, G_2} \neq \text{Unusual} \wedge \forall \overline{W_{G_1, G_2}}(j) \neq \text{Suspicious} \wedge \forall \overline{W_{G_1, G_2}}(j) \neq \text{Dangerous,} \\ \text{Infected, if } \exists \overline{W_{G_1, G_2}}(j) = \text{Dangerous} \vee K_B(G_1, G_2) \geq \delta, \\ \text{Suspicious else.} \end{cases}$$

# Experiments

## Experimental conditions



**Detection rate 92%, false positives 5-8%**

# Motivation

## Botnets' evasion techniques

DNS-tunneling

fast-flux service network

"domain flux" technology

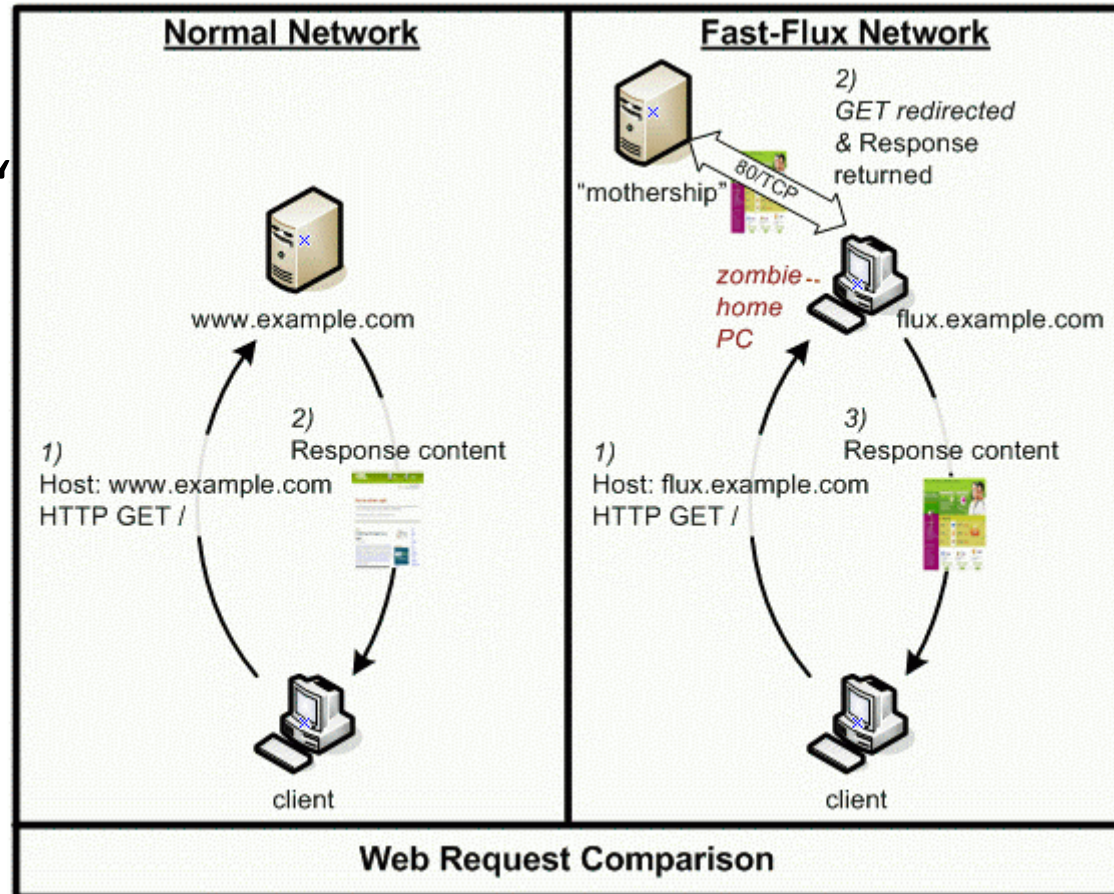
cycling of IP mappings



# Botnets' evasion techniques

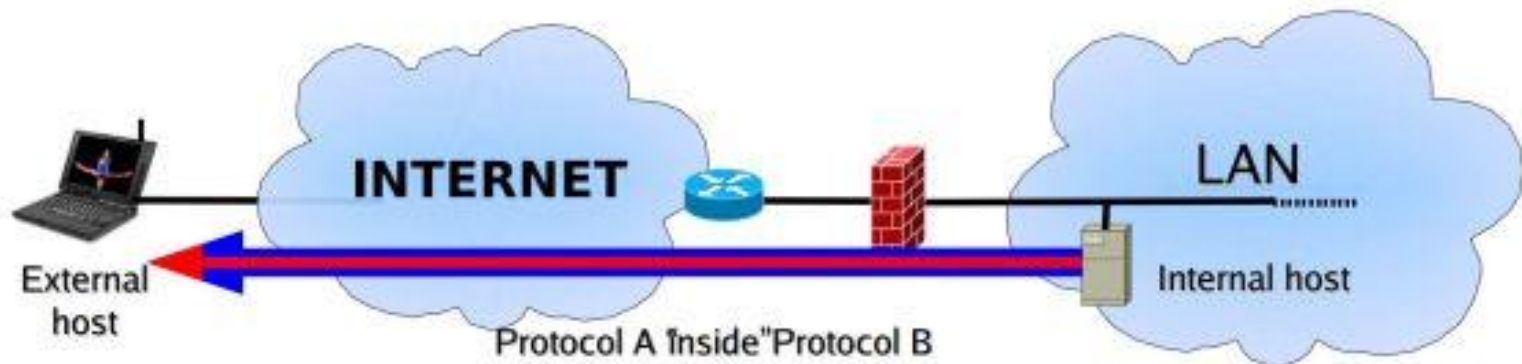
**Fast flux service network** uses a short TTL-periods and cyclic method of round-robin DNS.

Technique has an ability to evade the "black lists" of DNS

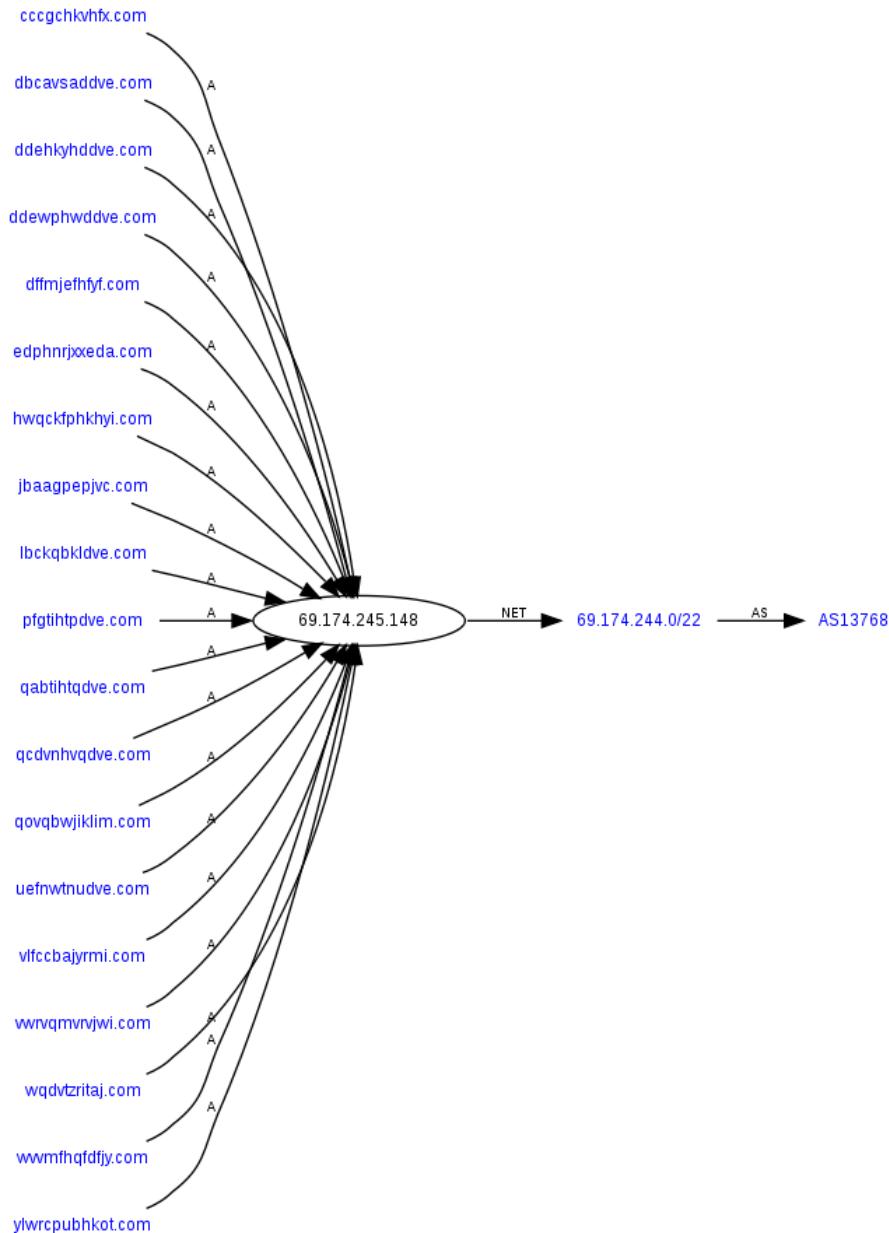


# Botnets' evasion techniques

**DNS-tunneling** allows an attacker to transmit an arbitrary traffic within the DNS-protocol specification by using the fields of a DNS-message in order to perform the botnet's command and control



# Botnets' evasion techniques

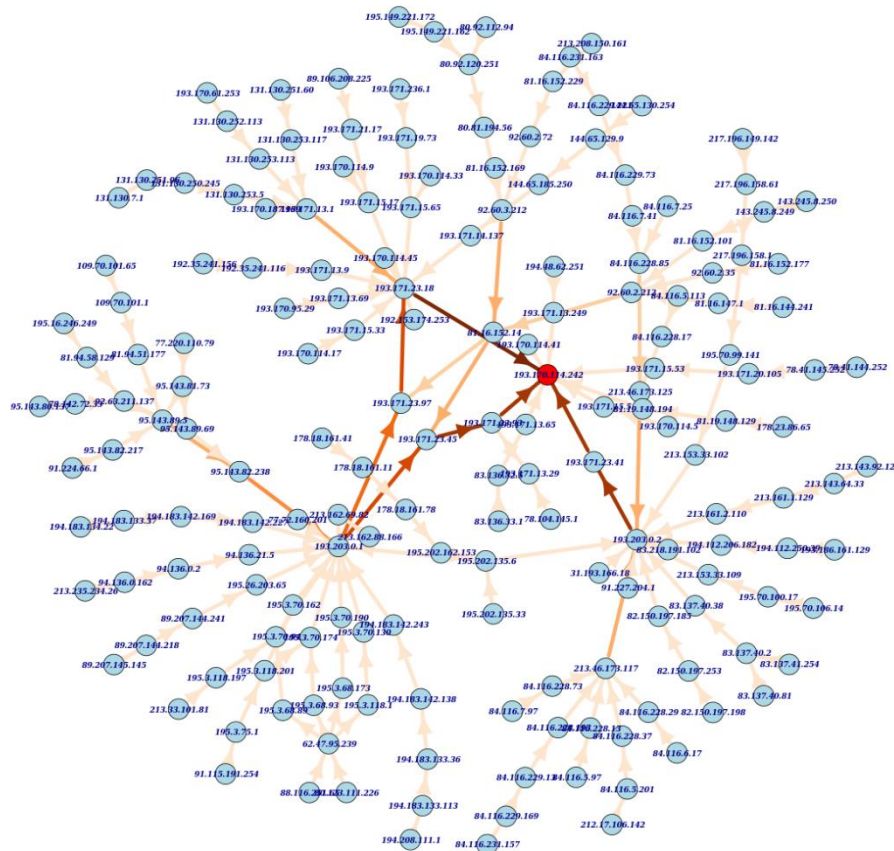


**Domain flux** - the technology that combines short TTL-periods and frequent changes of C&C-server's domain name



# Botnets' evasion techniques

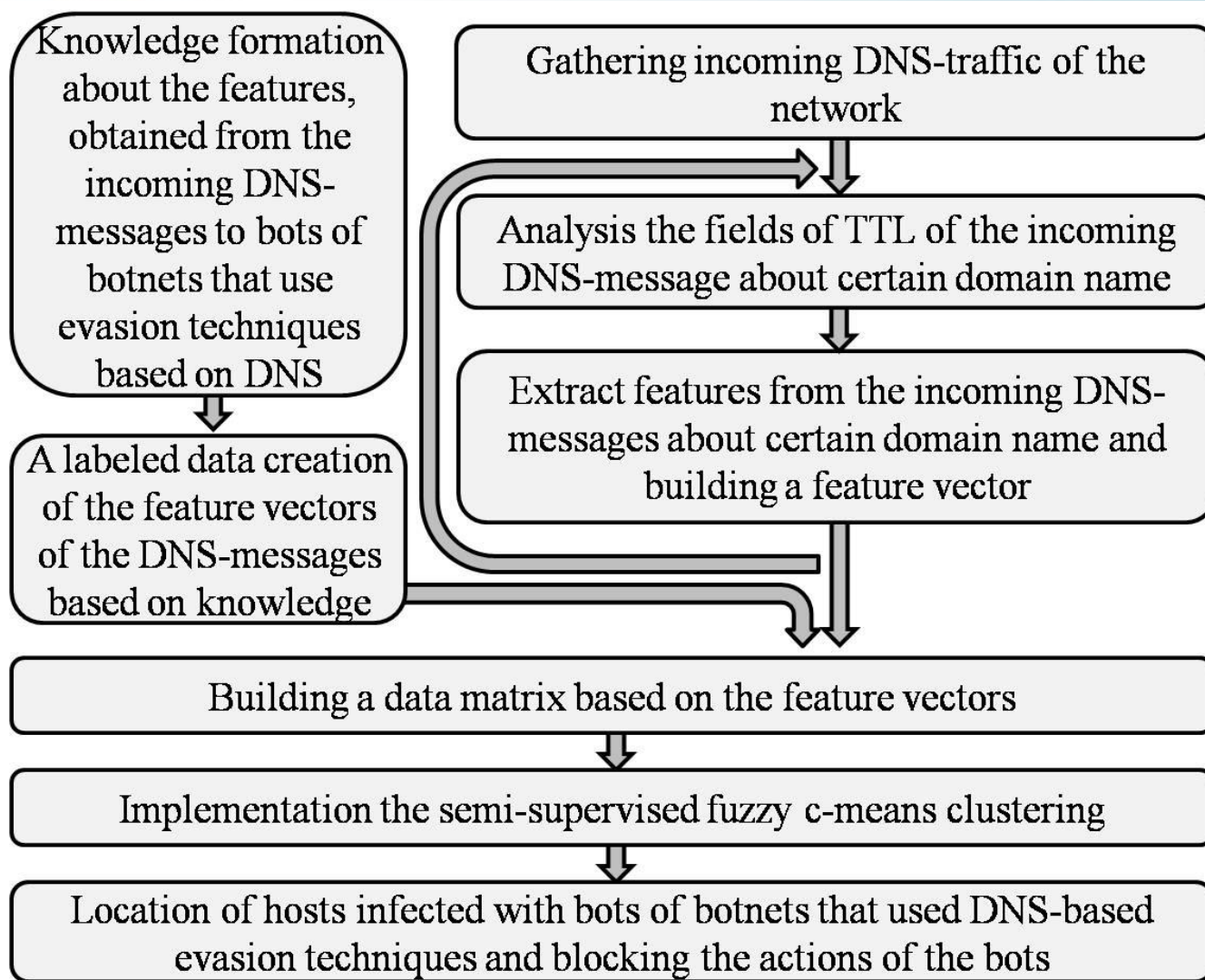
Cycling of IP mappings  
for the domain name of  
C&C-server



# Anti-evasion technique for botnets detection

- Technique is based on a cluster analysis of the features obtained from the payload of DNS-messages
- The method uses a semi-supervised fuzzy c-means clustering
- Usage of the developed method makes it possible to detect botnets that use the DNS-based evasion techniques with high efficiency

# THE SCHEME OF THE DNS-BASED ANTI-EVASION TECHNIQUE FOR BOTNETS DETECTION (PASSIVE MONITORING)



# The feature vector of the incoming DNS-message about domain name

$$\overline{W}_d = \left( L_N, N_U, E_N, T_{\text{mod}}, T_{\text{med}}, T_{\text{aver}}, N_A, N_{IP}, S_{IP}, S_A, N_{UA}, S_{UA}, N_D, F_{UR}, E_R, L_P, F_S \right),$$

where  $L_N$  - the length of the domain name;

$N_U$  - the number of unique characters in the domain name;

$E_N$  - entropy of the domain name;

$T_{\text{mod}}$  - TTL-period, mode;

$T_{\text{med}}$  - TTL-period, median;

$T_{\text{aver}}$  - TTL-period, average value;

$N_A$  - the number of A-records corresponding to domain name in the DNS-message;

$N_{IP}$  - the number of IP-addresses concerned with the domain name;

$S_{IP}$  - the average distance between the IP-addresses concerned with domain name;

$S_A$  - the average distance between the IP-addresses in the set of A-records for

domain name in the incoming DNS-message;

# The feature vector of the incoming DNS-message about domain name

$N_{UA}$  - number of unique IP-addresses in sets of A-records corresponding to the domain name in the DNS-messages (feature is used if value  $N_A > 1$ );

$S_{UA}$  - the average distance between unique IP-addresses in sets A-record corresponding to the domain name in the DNS-messages (feature is used if value  $N_A > 1$ );

$N_D$  - number of domain names that share IP-address corresponding to domain name;

$F_{UR}$  - the sign of the usage of uncommon types of the DNS-records, or DNS-records that are not commonly used by a typical client;

$E_R$  - entropy of the DNS-records, which are contained in the DNS-messages;

$L_P$  - maximum size of the DNS-messages about domain name;

$F_S$  - the sign of success of DNS-query ( $F_S = 0$  if DNS-query failed, and  $F_S = 1$  if DNS-query was successful)

$f_{E_B}$  - the dependence function of the DNS-message field entropy of its length

# Evasion techniques' concern

**Knowledge about evasion technique based on the features inherent to the DNS-message to bots presented as the rules:**

*if  $T_{\text{mod}} \in [0,900]$  and  $T_{\text{med}} \in [0,900]$  and  
 $T_{\text{aver}} \in [0,900]$  and  $F_S = 0$  and  $N_D \in [8; \infty] \Rightarrow$   
 $\Rightarrow$  domain\_flux*

*if ( $T_{\text{mod}} \in [0,900]$  and  $T_{\text{med}} \in [0,900]$  and  
and  $T_{\text{aver}} \in [0,900]$ ) and  
and ( $(N_A \in (5, \infty)$  and  $S_A \in (65535, \infty))$  or  
or ( $N_{UA} \in (8, \infty)$  and  $S_{UA} \in (65535, \infty)$ ))  $\Rightarrow$   
 $\Rightarrow$  fast\_flux*

# Evasion techniques' concern

**Knowledge about evasion technique based on the features inherent to the DNS-message to bots presented as the rules:**

*if  $(L_N \in [75,255])$  and  $N_U \in (27,37)$  or  $E_N \geq f_{E_{B32}}$  or  
or  $(E_R \geq f_{E_{B64}}$  or  $E_R \geq f_{E_{B256}})$  or  $F_{UR} = 1$  or  
or  $L_P > 300 \Rightarrow$  **DNS \_ tunneling***

*if  $T_{mod} \in [0,900]$  and  $T_{med} \in [0,900]$  and  
and  $T_{aver} \in [0,900]$  and  $N_{IP} \in (5, \infty)$  and  
 $S_{IP} \in (65535, \infty) \Rightarrow$  **cycling of IP mappings***

# Performing of the semi-supervised learning

**A labeled data creation of the feature vectors of the DNS-messages based on knowledge**

Let denote  $X = \{x_i\}_{i=1}^{N_x}$  the **labeled data**,

$Y = \{y_i\}_{i=1+N_x}^{N_z}$  as **unlabeled data**, where  $N_x$  - the number of objects in the labeled data,  $N_z$  - the total number of different domain names

Let denote  $H = \{h_i\}_{i=1}^{N_h}$  as a set of predefined clusters of objects,

$N_h$  - the number of **clusters**:

$h_1$  - cycling of IP mapping,

$h_2$  - domain flux,

$h_3$  - fast flux,

$h_4$  - DNS-tunneling,

$h_5$  - cluster that contains normal queries

Each **feature vector** of labeled data belongs to one of the predefined clusters



# Botnet Detection Process

## Building a data matrix based on the feature vectors

Using the **feature vectors**  $\overline{W}_d$  we form the incoming DNS-messages, the **data matrix V**.

Each line of matrix **V** is the feature vector of incoming DNS-messages  $\overline{W}_d$  about certain domain name,  $V = (v_{ij})_{i=1, j=1}^{N_z, N_q}$ ,  $V(i, ) = \overline{W}_d$ ,

where  $N_q$  - the total number of features of the incoming DNS-messages that indicate the **use the evasion techniques by bots** of botnets

# Botnet Detection Process

Implementation the **semi-supervised fuzzy c-means clustering** for identifying the queries in the network that may indicate the functioning of the bots of botnets

The **objects of the clustering** are the **feature vectors**, obtained from payload of the incoming DNS-messages about certain domain name

The **result of clustering** is a **degree of membership** of the feature vectors to one **of four clusters**, where the membership of feature vector  $\overline{W}_d$  to cluster  $h_i, i = \overline{1,4}$  indicates the queries executing using the evasion techniques.

Membership of the feature vector to the **fifth cluster** indicates that the queries were performed to **legitimate resources**

As the distance between the clustering object and center of cluster the **Mahalanobis distance** was used

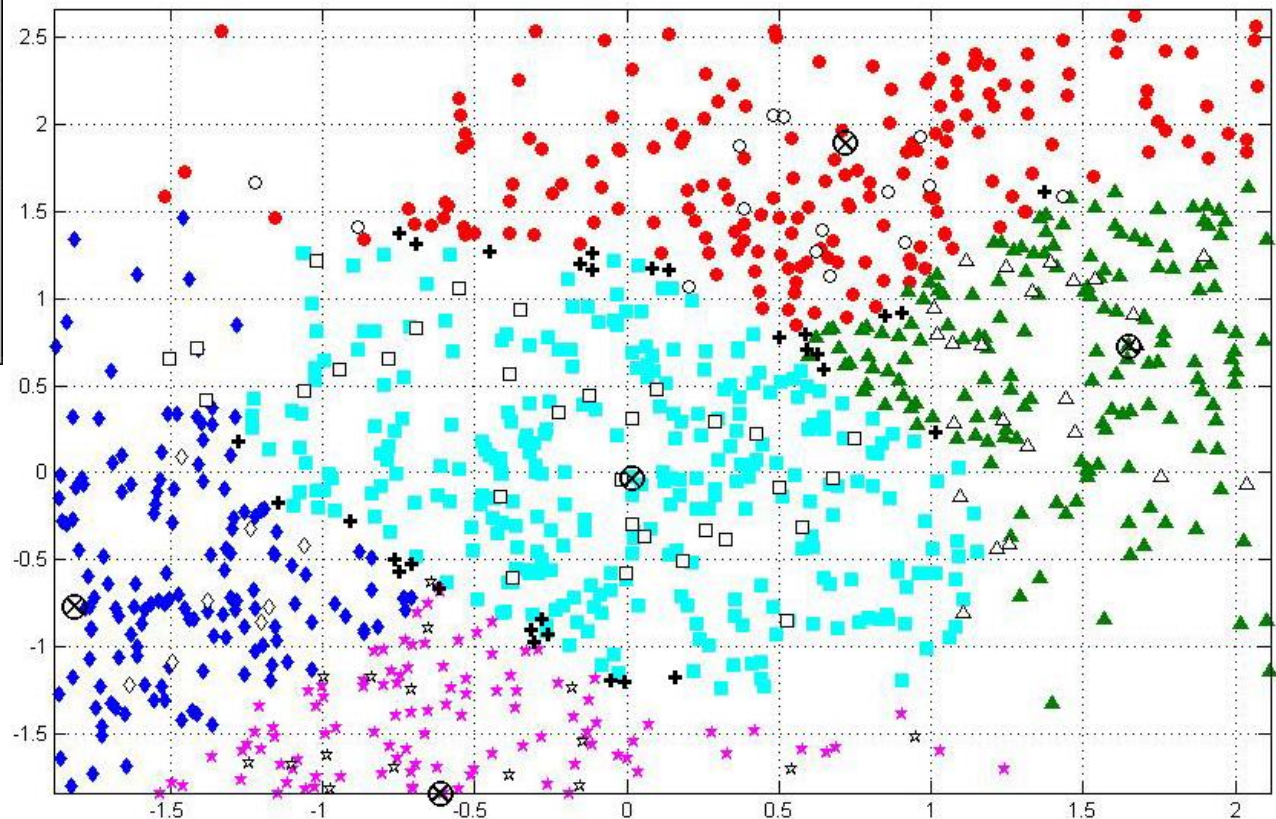
Based on the logs we can **localize** the bots of botnet in the network and **block** their actions

# Experiments without Active Probing

## The results of the clustering

Plane projection of the set of feature vectors of DNS-messages, which are distributed on clusters

- Fast-flux - unlabeled data
- ▲ Domain flux - unlabeled data
- Normal - unlabeled data
- ◆ Cycling of IP mappings - unlabeled data
- ★ DNS-tunneling - unlabeled data
- Fast-flux - labeled data
- △ Domain flux - labeled data
- Normal - labeled data
- ◇ Cycling of IP mappings - labeled data
- ☆ DNS-tunneling - labeled data
- ⊗ Centroid



# Active DNS probing

## Features obtained by means of active monitoring

$S_{NS}$  - the average distance between the IP-addresses for the set of NS-records for the domain name;

$N_{NS}$  - number of the NS-records in the DNS-response ;

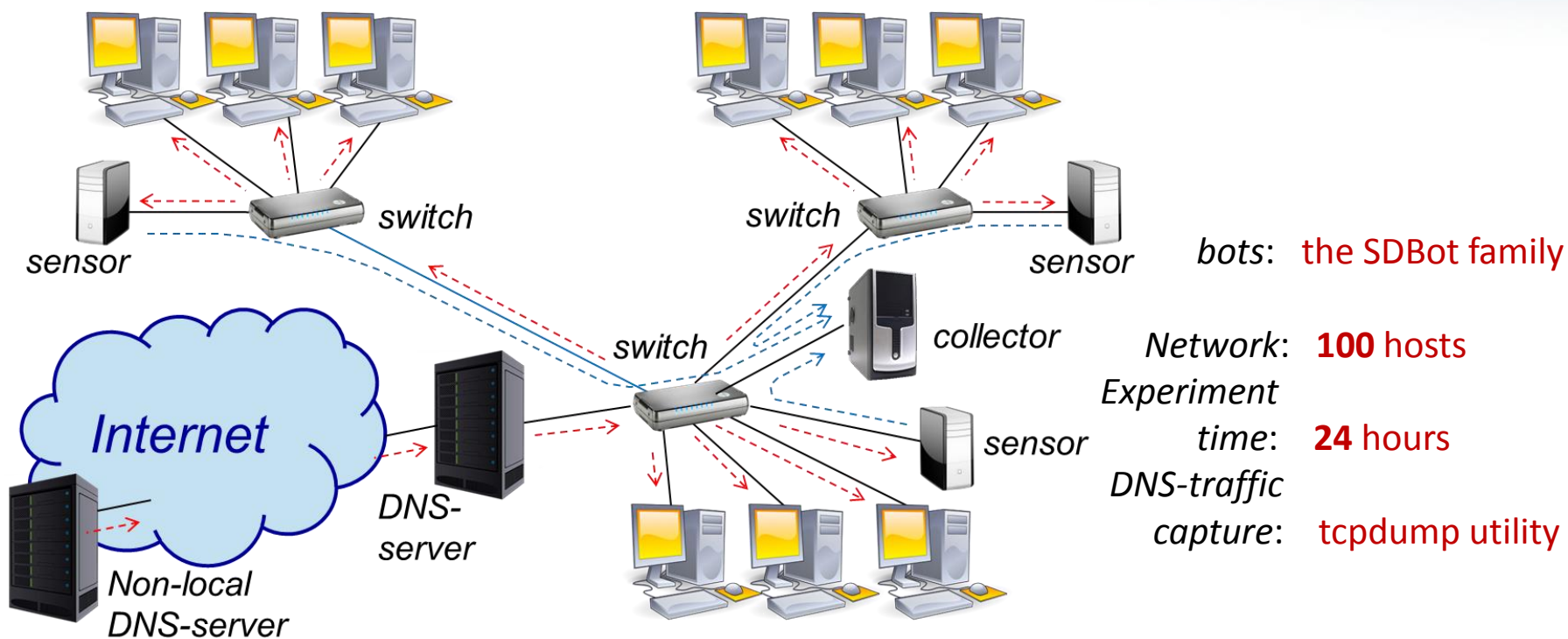
$V_{retry}$  - value of the fields **retry**, received from the DNS-response by a SOA-request;

$N_{ASN}$  - amount of different numbers of autonomous systems, which include IP-addresses associated with server names;

$N_{ASA}$  - the number of different numbers of autonomous systems (ASN), which include IP-addresses associated with the domain name

# Experiments

## Experimental conditions



# Experiments

Experimental results number of queries carried out by bots, **detected queries** carried out by bots and **false positives**

Name of evasion technique	Number of queries carried by bots	Botnets detection technique based on passive monitoring, described in [9]	Improved botnets detection technique based on passive monitoring	Botnets detection technique BotGRABBER based on passive and active monitoring
		Detected queries carried out by bots/ False positives, %		
h1, cycling of IP mapping	308	299/2	301/2	301/1
h2, "domain flux"	1432	1326/3	1406/3	1406/1
h3, "fast flux"	485	389/3	425/3	425/2
h4, DNS-tunneling	144	142/0	142/0	142/0
<b>Total</b>	2369	2156(91%)/8	2274(96%)/8	2274(96%)/4

# Summary

- We have to be well prepared for future botnets
  - Only studying current botnets is not enough
- It is an ongoing war between botnet attacks and defenses

# Questions