# Building Your Own WAF as a Service and Forgetting about False Positives



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#### **About me**

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#### WAF?

- Web Application Firewall
- Mainly used to protect against Application Attacks
- SQLi, RCE, Protocol Violations, Rate Limiting ...



#### **Deployment mode - Inline**

#### • Pros:

- Traffic inspection
- Ability to block
- Transparent for web servers

#### Cons:

- Network placement
- Latency





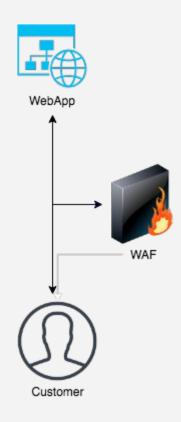
#### Deployment mode - Out of band

#### • Pros:

- Traffic inspection
- Transparent for web servers
- Simpler network placement

#### Cons:

- Can't block attacks
- PFS





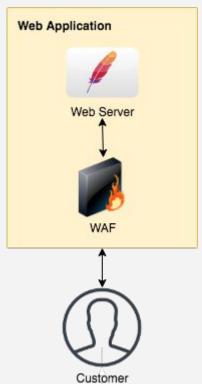
## **Deployment mode - Agent**

#### • Pros:

- Easier network placement
- Simple to scale

#### Cons:

- More invasive on deployment environment
- Can be less efficient on resource allocation

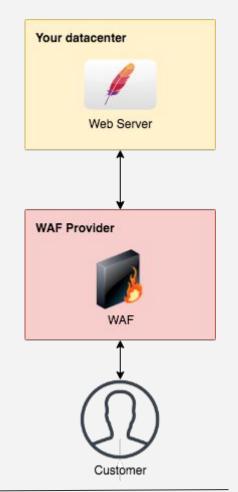




## **Deployment mode - Cloud**

- Pros:
  - Simple to setup and scale
  - Network effect

- Cons:
  - Out of your control
  - Latency





#### **Caveats with typical WAF Solutions**

- Network placement
- False positive rate
- Lack of control from developers



#### A challenging environment

- No acceptance for false positives
- Reluctance towards commercial appliances
- Blocking could only happen through the Application
- Latency would not be acceptable



#### **Building the WAF as a Service**

- Removes false positives by having an understanding of the application context
- No need for an appliance, just add an API call
- Blocking behaviour is decided by the application
- Ability to avoid latency for regular users



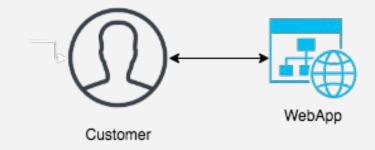
## How could you build one?

- Open source components already exist
- Creating a log processing pipeline
- Building a WAF API
- Library for logs and calling API



#### Study case: Simple web application

- Setup in Google Cloud
- Simple Flask Application
- Code available in github





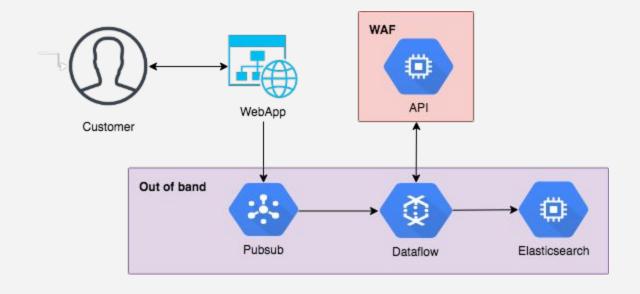
# **Deployment mode?**

• Let's compare



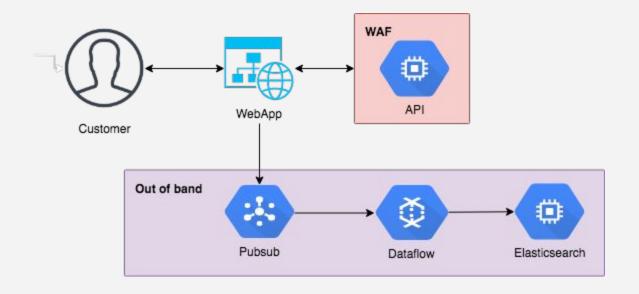


#### Out of band mode





#### Inline mode





## **Every application is different**

- Threat model
- FP tolerance
- Risk acceptance

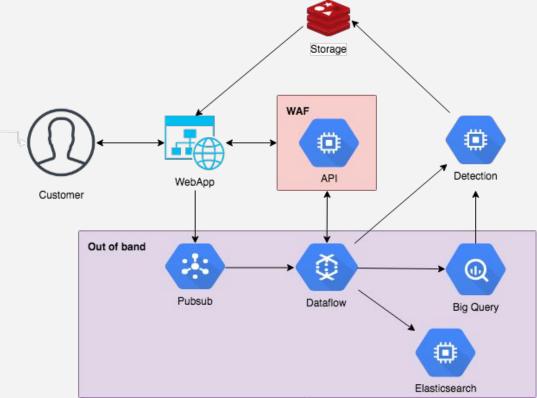


## Finding a middle ground

- Out of band mode removes latency concerns on users
- Inline mode provides security by blocking attacks
- Could we get the best of both worlds?



#### **Hybrid mode**





#### **Components - Web application**

- Can decide which mode to work on
  - Inline
  - Out of band
- Sends logs with partial request data encrypted



**Example: Flask API** 

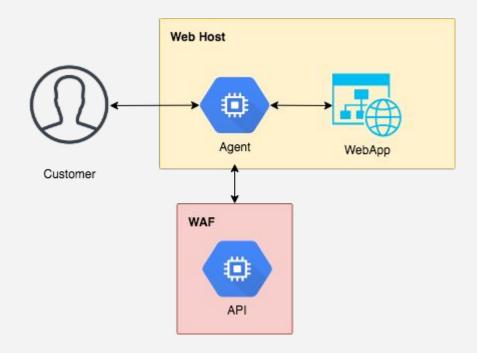


# **Components - Agent**

- Acts as a proxy to Web Application
- Minimal footprint
- Application agnostic
- Gets settings from application



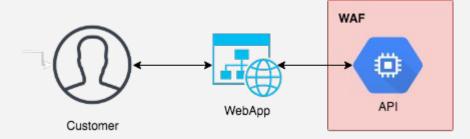
# **Components - Agent**





## **Components - Library**

- Simpler to implement
- Will be tied to Application framework
- Inherent risks
- Strategy for this talk





## **Components - Historical database**

- Historical activity
- Business value
- Patterns of behaviour for FP





#### **Components - State store**

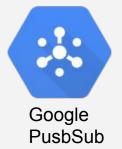
- Allows to store configuration
- Ideally fast lookup for caching





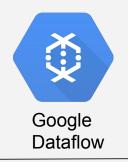
# **Components - Log streaming**

- Streaming pipeline
- Web requests are encapsulated and sent through it

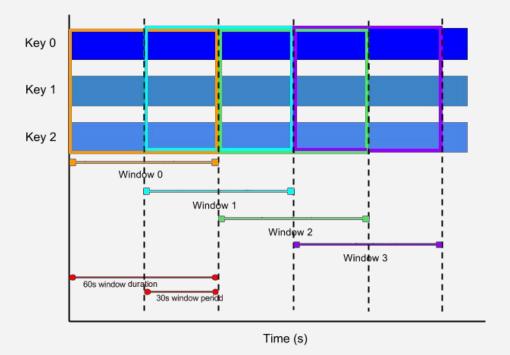




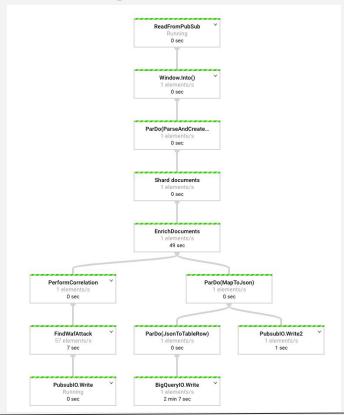
- Replays events not in line against WAF
- Calculates scores through windows of time



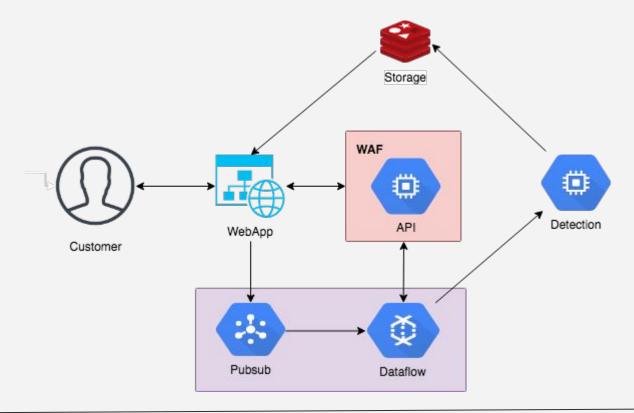














- Pluggable architecture
- Parallel nature of their components
- Applications can decide how to react



- Open source components
  - Modsecurity
  - Naxsi



- Custom modules
  - Apply custom business logic
  - Implement simple services
    - Rate limiting
    - Rule engine for blocking



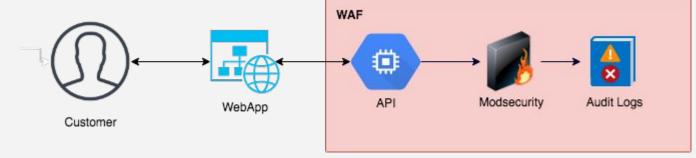
ML models

- Proprietary software or appliances
  - Reduced complexity of installation
  - Simple way of evaluation



## **WAF** service - Example: Modsecurity

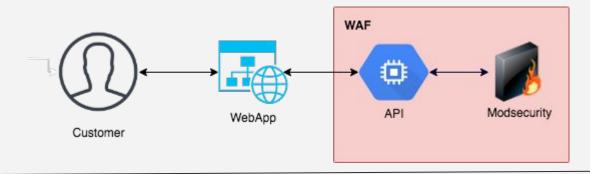
- Could be made api driven through libModSecurity
- Can run on Apache HTTP Server or NGINX
- Results are written as logs





# WAF service - Modsecurity as an API

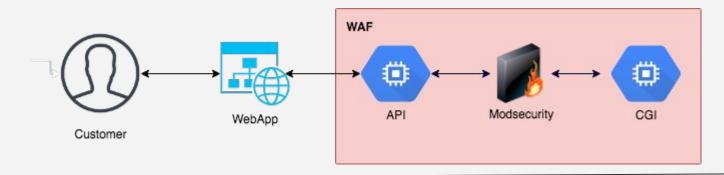
 SecRule REMOTE\_ADDR "@unconditionalMatch" "phase:4,id:999434,prepend: ...





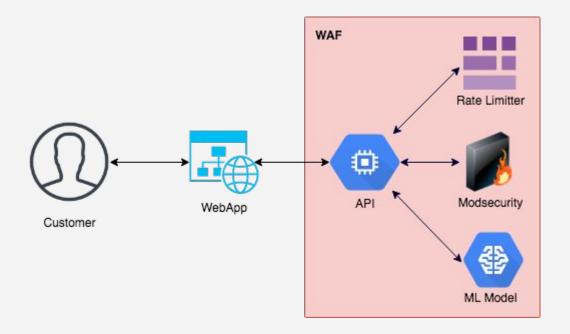
## WAF service - Modsecurity as an API

- Implementing response body analysis
- Body is sent to CGI for replay





#### **WAF** service





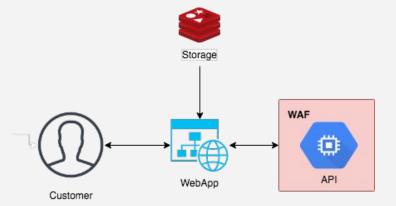
#### How to block?

- We decide when to send traffic to the WAF
- Manually or automatically decided



# **Traffic routing**

- Fingerprint based routing
  - Blocks based on scores



- IP, client\_id, combinations, 0day fingerprints...
- Added automatically or manually



# **Traffic routing**

- Net block based routing
  - ISP
  - Hosting providers
  - Tor exit nodes / Proxies



## **Traffic routing**

- Virtual Patching
  - Always route particular vulnerable endpoints
  - Select for combination of parameters if needed
  - Example: website.com/?vuln\_param=



- Detection FP vs blocking FP
- Key to allow blocking without impacting users
- Acceptable rate might change per application



- Business logic
  - How trustworthy is a user/ip?
  - Key business activity
  - What would be the impact on blocking them



- Historical Analysis
  - How normal is this type of request for this endpoint?
  - How does this user compare with others
  - How common are detection FP in this endpoint



- Context analysis
  - How many times have they triggered a FP
  - How many requests have they sent



- Example: Sleep(
  - message="I sleep(1 or 2 days)"
    - Might be detected as SQLI
    - Probability of FP is independent from each other



- Independant SQLI FP rate: 0.1%
- Our aim, 0.00001% (0.01<sup>5</sup>) => Score 5
- Block can happen only for SQLis
- Aimed at attacks that need volume



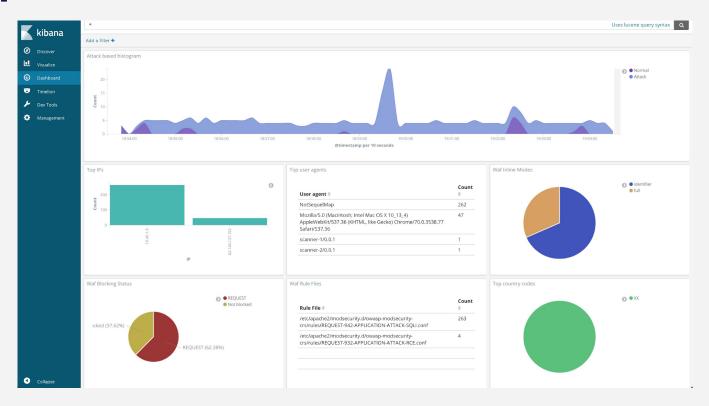
- Easily understand activity
- Visibility on attacks
- Performance metrics



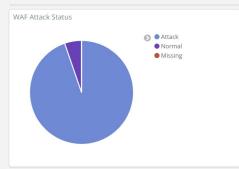


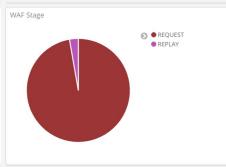
**Example: ELK** 











Waf Alart Matched Var Names

Matched Vars	Count
"SELECT * FROM INFORMATION_SCHEMA"	33
SELECT * FROM INFORMATION_SCHEMA	4
-1002%') OR 8810=9444 AND ('%'='	1
-1003 OR 9348=8785	1
-1008 OR 7376=7376#	1
-1010') OR 6010=6010	1

Log Data 🕏	Coun:
Matched Data: INFORMATION_SCHEMA found within ARGS:param: "SELECT * FROM INFORMATION_SCHEMA"	33
Matched Data: INFORMATION_SCHEMA found within ARGS:param1: SELECT * FROM INFORMATION_SCHEMA	4
Matched Data: 1&1 found within ARGS:id: -1003 OR	1

Var Name 🕏	Coun
ARGS:id	6,625
REQUEST_URI	593
ARGS:param	33
ARGS:param1	6
ARGS_NAMES:CXZW=6856 AND 1=1 UNION ALL SELECT 1,2,3,table_name FROM information_cchama_tables_WULEDE 2>1	1

Message \$	Count
SQL Injection Attack Detected via libinjection	6,449
Remote Command Execution: Windows Command Injection	176
SQL Injection Attack: Common DB Names Detected	45
Restricted File Access Attempt	1



Wafs	earch							v <sup>2</sup>
							1–50 of 311 <b>〈</b>	>
	Time 🔻	waf_request_time_spent	waf_mode	$waf\_request\_answer.mod security.alerts.alert.log data$	waf_block	waf_status	waf_request_answer.rate_limiter.	.is_aı
•	November 29th 2018, 19:04:30.882	0.4041290283203125	identifier	Matched Data: s)&(s found within ARGS:id: 1') OR NOT 5749=6432 AND ('YQom' LIKE 'YQom	REQUEST	Attack	0	
•	November 29th 2018, 19:04:28.703	0.3751790523529053	identifier	Matched Data: s&sos found within ARGS:id: 1' OR NOT 6486=6486 AND 'vqoO'='vqoO	REQUEST	Attack	0	

<pre># waf_request_answer.modsecurity.is_attack</pre>	<b>Q Q □ *</b> 1
<pre># waf_request_answer.rate_limiter.is_attack</pre>	<b>Q Q □ *</b> 0
<pre># waf_request_answer.rule_engine.is_attack</pre>	<b>⊕ ⊖</b> □ <b>*</b> 0
t waf_request_answer.status	<b>Q Q</b> □ <b>*</b> Attack

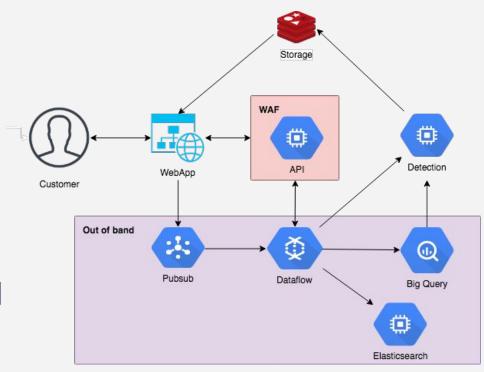


Rate limit counters:    Time Bucket   Identifier   Value   Counter   TTL     2018-11-29 22:49:00   ip   10.40.1.8   50   55     2018-12-92 22:49:00   user-agent   notsequelmap   50   55     2018-11-29 22:50:00   ip   10.40.1.8   3   59	root@waf-5c65d	:789c8-sxzr6	/# python	/api/manage.py -	show-confi	g=1				
Request Stage   identifier   Response Stage   disabled   Scoring threshold   5			========			======	=====			
Response Stage   disabled   Waf Proxy Routing   disabled   Scoring threshold   Scori	Config	g   St	atus							
Identifier   Value	Response S Waf Proxy Ro	Stage   dis outing   dis	abled   abled							
ip   10.40.1.8   2018-11-29 22:45:23   alerter_script   ip   62.140.137.152   2018-11-29 22:45:26   alerter_script	/AF Identifier	r based routi	.ng:			======	=====			
ip 62.140.137.152   2018-11-29 22:45:26   alerter_script	Identifier	Value		Added at	Created	by				
Endpoint   Added at   ping   2018-11-29 22:49:58    Block Rules Configured:  Identifier   Value   Added at   user-agent   mozilla/5.0 (windows nt 6.1; win64; x64; rv:58.0) gecko/20100101 firefox/58.0   2018-11-29 22:49:44   manage_script  Rate limit counters:  Time Bucket   Identifier   Value   Counter   TTL   2018-11-29 22:49:00   ip   10.40.1.8   50   55   2018-11-29 22:49:00   user-agent   notsequelmap   50   55   2018-11-29 22:50:00   ip   10.40.1.8   3   59										
ping   2018-11-29 22:49:58      Identifier   Value   Added at   Created by     user-agent   mozilla/5.0 (windows nt 6.1; win64; x64; rv:58.0) gecko/20100101 firefox/58.0   2018-11-29 22:49:44   manage_script    Rate limit counters:	·		+			======	====			
Identifier   Value										
user-agent   mozilla/5.0 (windows nt 6.1; win64; x64; rv:58.0) gecko/20100101 firefox/58.0   2018-11-29 22:49:44   manage_script  Rate limit counters:  Time Bucket   Identifier   Value   Counter   TTL    2018-11-29 22:49:00   ip   10.40.1.8   50   55   2018-11-29 22:49:00   user-agent   notsequelmap   50   55   2018-11-29 22:50:00   ip   10.40.1.8   3   59	Block Rules Co	onfigured:	=======				====			
Time Bucket   Identifier   Value   Counter   TTL    2018-11-29 22:49:00   ip   10.40.1.8   50   55   2018-11-29 22:49:00   user-agent   notsequelmap   50   55   2018-11-29 22:50:00   ip   10.40.1.8   3   59	Identifier	+ 		,	Value				Added at	Created by
Time Bucket   Identifier   Value   Counter   TTL    2018-11-29 22:49:00   ip   10.40.1.8   50   55    2018-11-29 22:49:00   user-agent   notsequelmap   50   55    2018-11-29 22:50:00   ip   10.40.1.8   3   59	user-agent	mozilla/5.0	(windows	nt 6.1; win64;	x64; rv:58.0	) gecko	/20100101	firefox/58.0	2018-11-29 22:49:44	manage_script
2018-11-29 22:49:00   ip   10.40.1.8   50   55   2018-11-29 22:49:00   user-agent   notsequelmap   50   55   2018-11-29 22:50:00   ip   10.40.1.8   3   59	Rate limit cou	======= unters:	=======				====			
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2018-11-29 22:50:00   user-agent   notsequelmap   3   59	2018-11-29 2 2018-11-29 2	22:49:00   us 22:50:00	er-agent ip	notsequelmap	50   3	55				



#### **Hybrid mode**

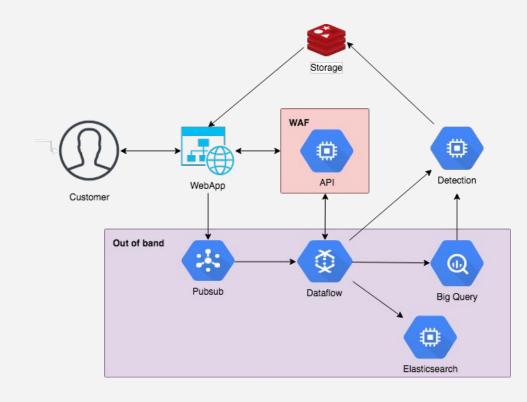
- Benefits
  - Can reduce latency
  - Flexibility
  - FP rate can be decided





## **Hybrid mode**

- Caveats
  - Delayed response time for blocking
  - Complexity









#### What now?

- Try it!
- https://github.com/89berner/waf-api-talk
- git clone https://github.com/89berner/waf-api-talk && cd waf-api-talk; ./setup \$YOUR\_GCP\_PROJECT
- Questions?

