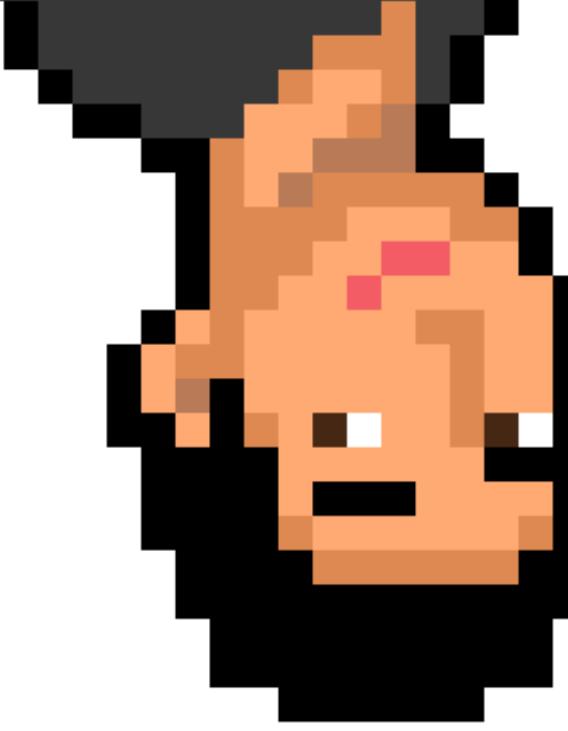


Identifying Novel Malware at Scale

Pedram Amini | InQuest.net



Who I be.



 New York City native. Austin Texas since 2005. 😊

Self taught in the 90's through SoftICE & phreaking.

iDEFENSE VCP 2002-2005, TippingPoint [ZDI](#) 2005-2010.

[OpenRCE.org](#), [PaiMei](#), [Sulley](#), [Fuzzing \(book\)](#).

[Jumpshot](#) 2010-2014, [InQuest](#) 2014+.

Threat hunting/intelligence and automation.





Low Hanging Fruit



There are some beautiful exploits out there...

But how are people getting owned?



Invoice scams.



Phishing.



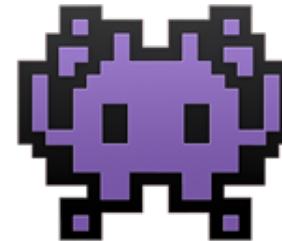
Open S3 buckets and Elastic databases.



Carrier lures...

A Formula for Success

1. Construct novel carrier(s). Exploit(s) optional.
2. Own, pwn, or utilize shared hosting in the .
3. Seed via some SPAM and... .



2018	2019	2020
[O] CVE-2012-0158	[O] CVE-2012-0158	[J] CVE-2012-4681
[A] CVE-2015-1805	[O] CVE-2015-1641	[W] CVE-2014-6352
[I] CVE-2016-0189	[O] CVE-2017-0143	[W] CVE-2016-7255
[O] CVE-2017-0199	[O] CVE-2017-0199	[O] CVE-2016-7262
[O] CVE-2017-11882	[O] CVE-2017-11882	[O] CVE-2017-0199
[O] CVE-2017-8570	[O] CVE-2017-5638	[O] CVE-2017-11882
[O] CVE-2017-8750	[O] CVE-2017-8759	[P] CVE-2018-4893
[F] CVE-2018-4878	[F] CVE-2018-4878	[I] CVE-2019-1367
[I] CVE-2018-8174	[O] CVE-2018-7600	[W] CVE-2019-1405
[I] CVE-2018-8373	[O] CVE-2019-0604	[W] CVE-2020-0601

Adobe [F]lash / [P]DF | Google [A]ndroid | Oracle [J]ava | Microsoft [I]E / [O]ffice / [W]indows

Microsoft Excel Macrosheets

There's *always* something with Microsoft Office.

Tens of millions of lines of code, decades of features.

Deep dive into the breaking wave of XLM carriers:

- 2019-01-29: [Extracting "Sneaky" Excel XLM Macros](#)
- 2020-03-18: [Getting Sneakier: Hidden Sheets & Data Connections](#)
- 2020-05-06: [ZLoader 4.0 Macrosheets Evolution](#)

Tool: [XLMMacroDeobfuscator](#) YARA Rules: Github/InQuest



More on #maldoc's

Didier Stevens, NVISO

Maldocs Tips for Red Teamers

@didierstevens

[blog](#)

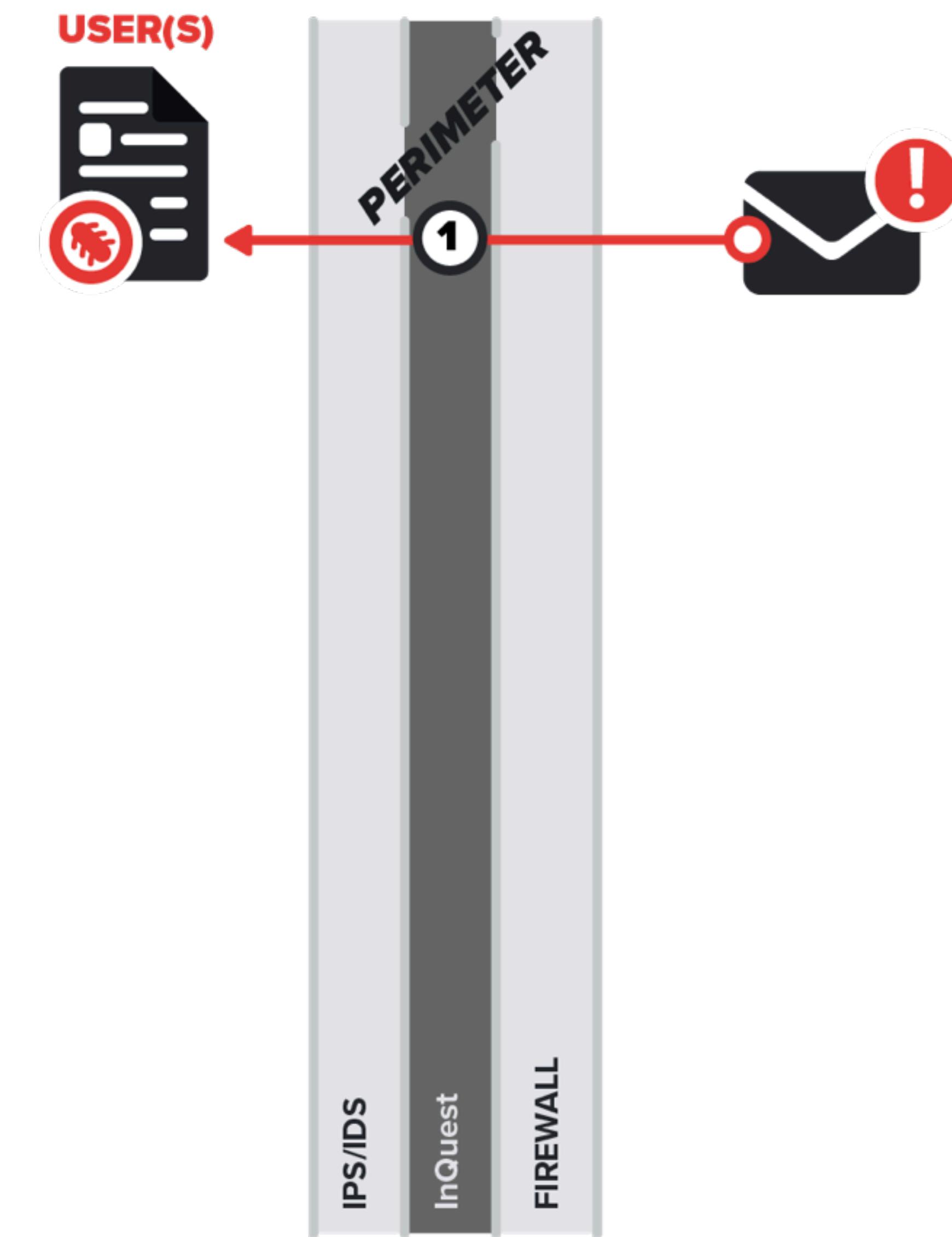
Overview examples

- 1 The power of strings
- 2 Limiting the power of strings
- 3 Very hidden
- 4 Very, very hidden? (D)
- 5 Unused bits (D)
- 6 VBA stomping
- 7 VBA purging
- 8 Code signing tampering (D)

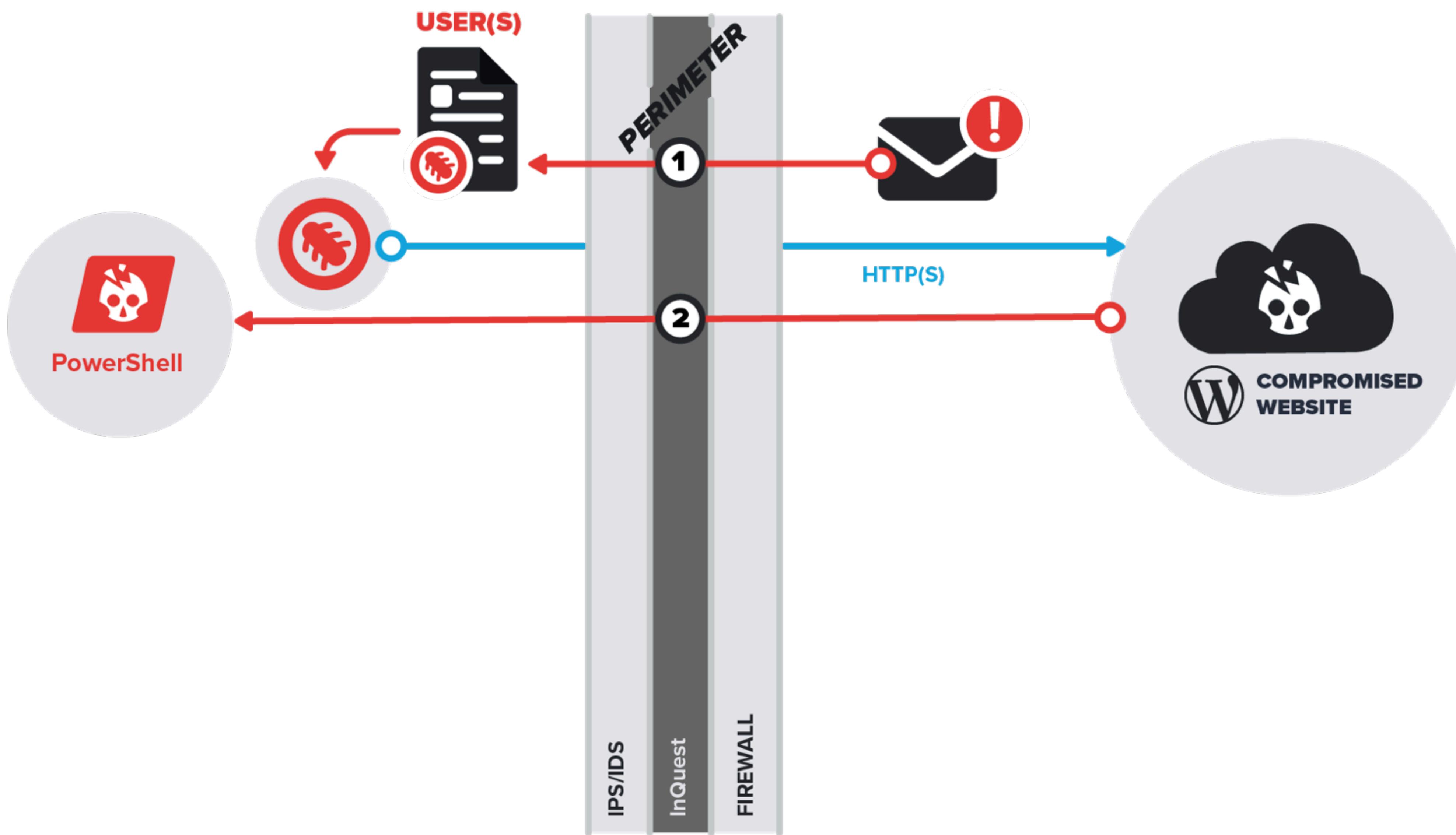


(D) = Disclosure

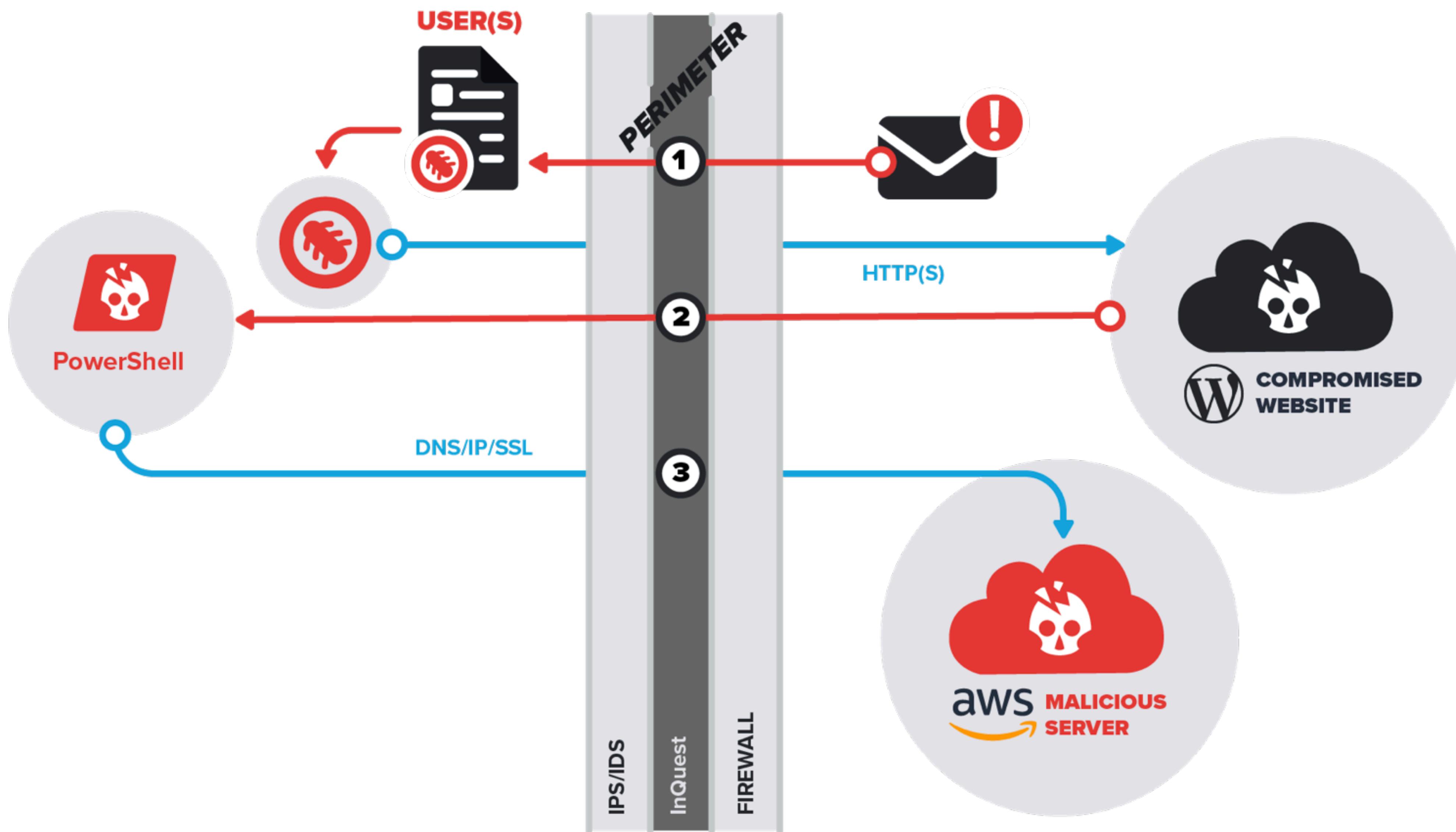
Common Malware Campaign



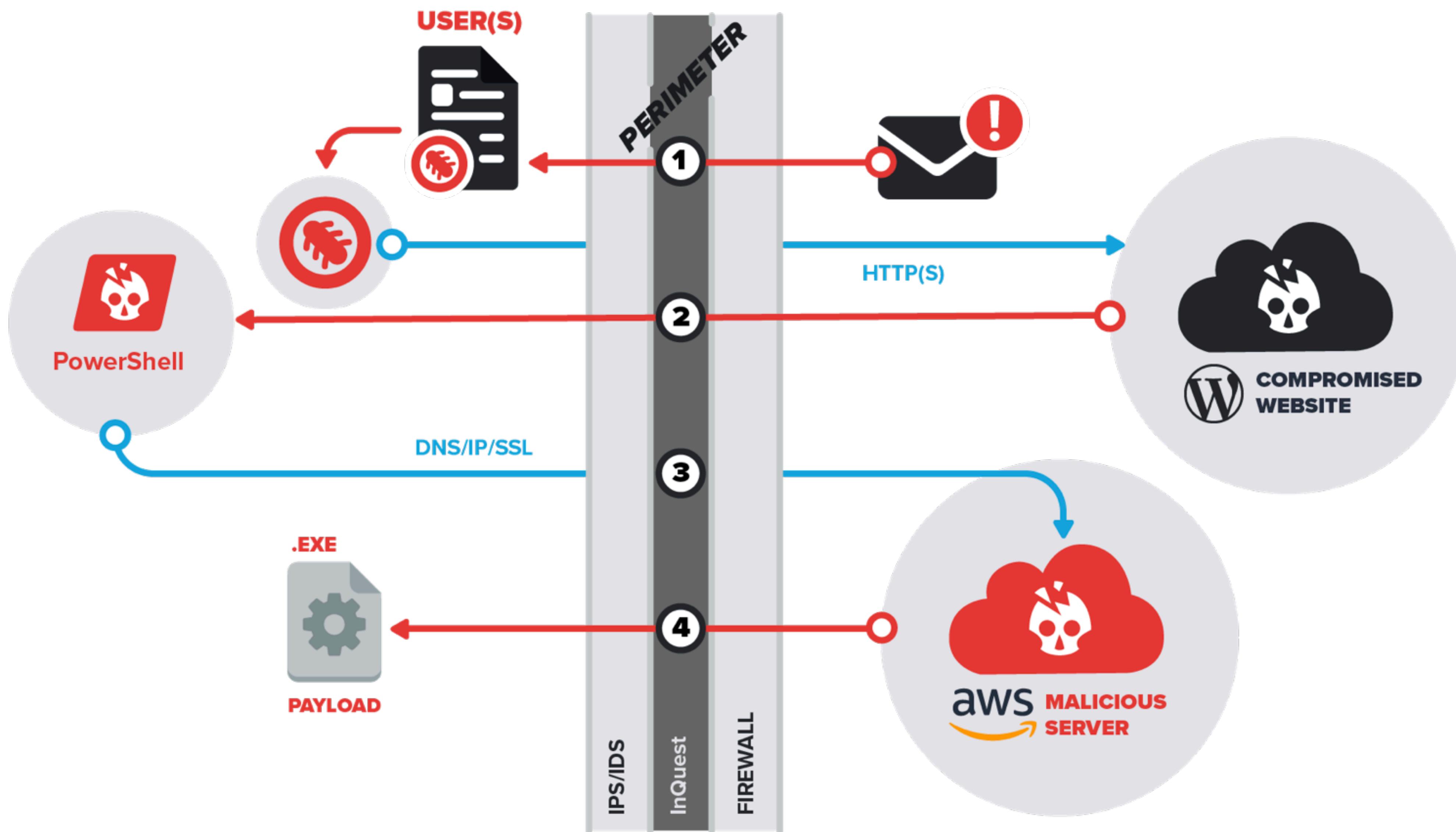
Common Malware Campaign



Common Malware Campaign



Common Malware Campaign



Infrastructure Pivots

Domain -> IP -> Domain(s)

Domain -> DNS -> Domain(s)

Domain -> Pattern -> Domain(s)

Domain -> Registrant -> Domain(s)

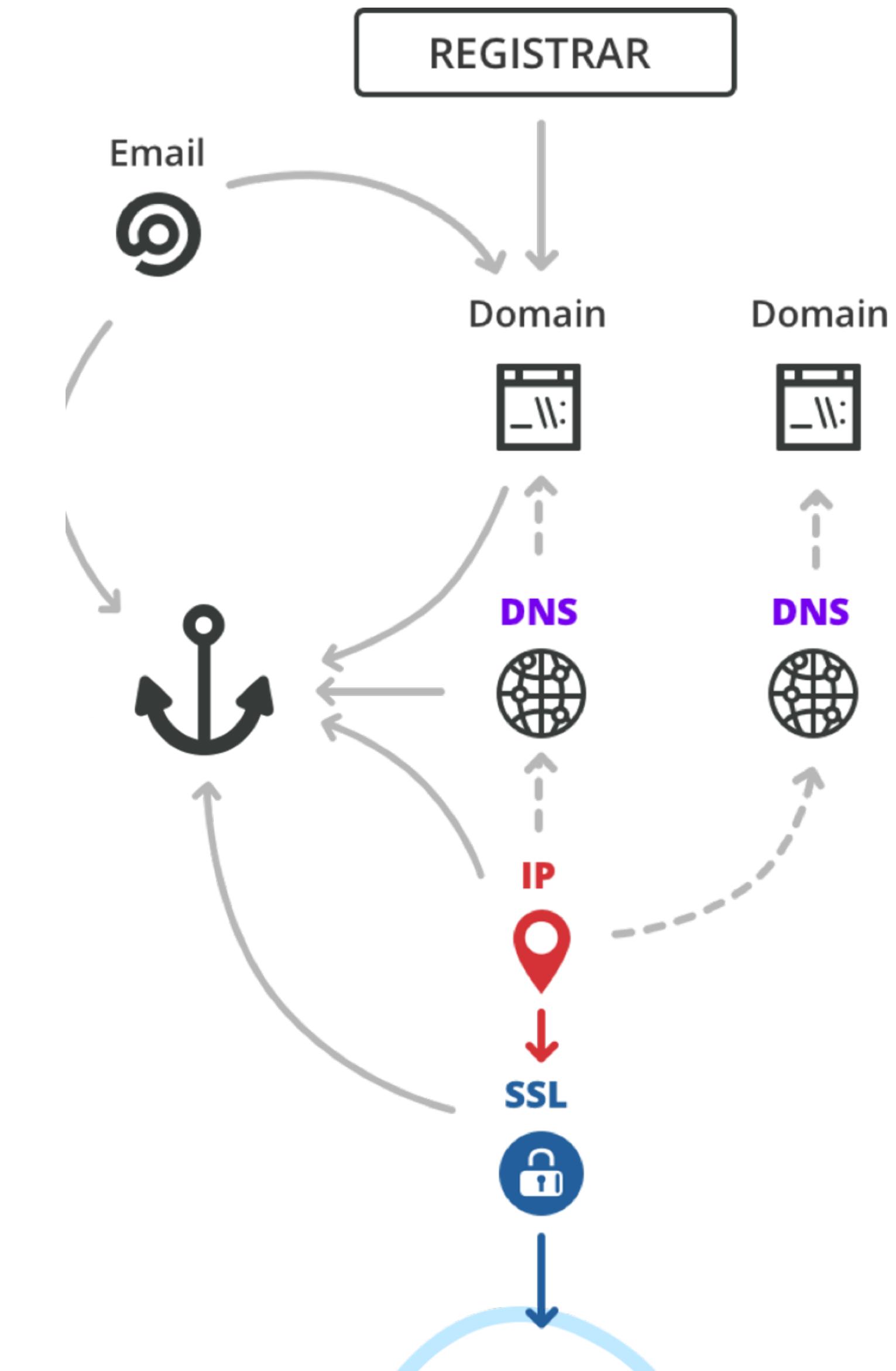
Domain -> Sub Domains(s)

IP -> ASN -> IP(s)

SSL Certificates

Google Analytics IDs

...and more...



Infrastructure Pivots

IP Pivots:

Domain -> IP -> Domain(s)

- <https://reverseip.domaintools.com/search/?q={ip}>
- <https://www.shodan.io/host/{ip}>
- <https://viz.greynoise.io/ip/{ip}>
- <https://www.virustotal.com/#/ip-address/{ip}>

Domain -> Sub Domains(s)

DNS Pivots:

IP -> ASN -> IP(s)

- <http://whois.domaintools.com/{domain}>
- <https://www.virustotal.com/#/domain/{domain}>

Google Analytics IDs

...and more...

REGISTRAR

Email

Domain

Domain



DNS

DNS



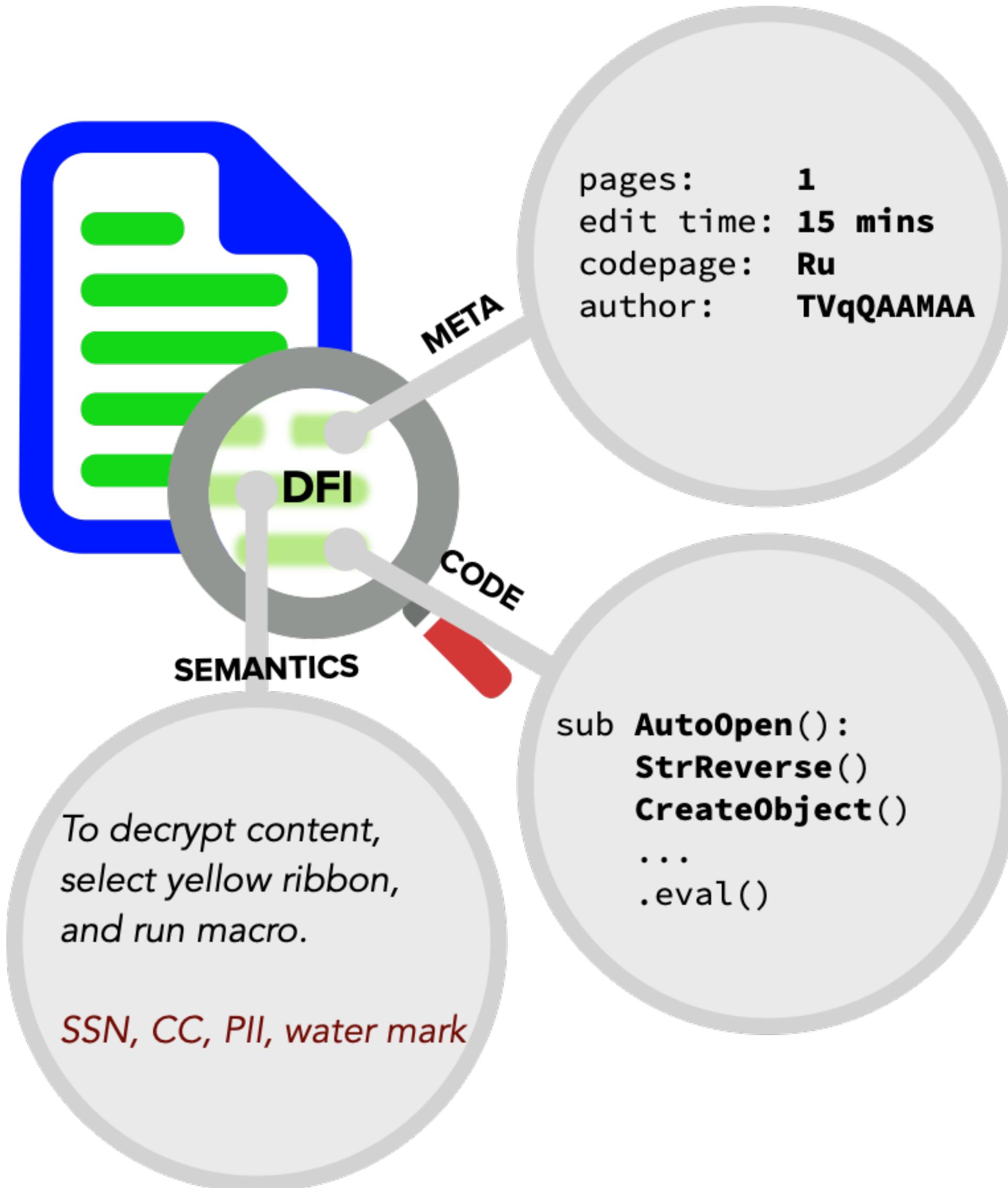
IP



SSL



File Pivots



IP Address

Domain Name

URL

Email Address

File Name / Pattern

Adobe XMP ID

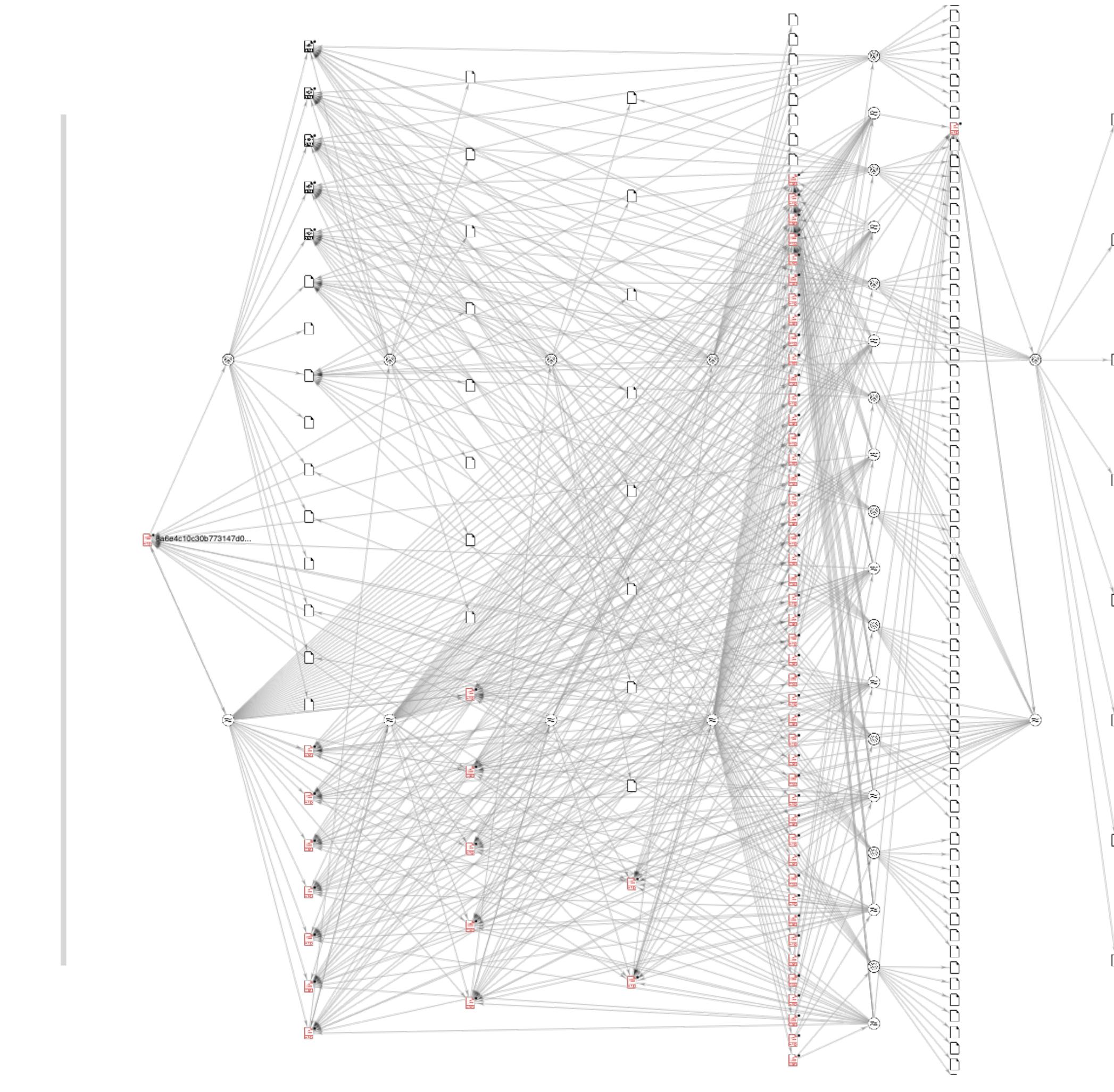
AV Labels

Graphical Lure

...

File Pivots

IP Address
Domain Name
URL
Email Address
File Name / Pattern
Adobe XMP ID
AV Labels
Graphical Lure
...



Pivoting on XMP IDs

Adobe Extensible Metadata Platform (XMP).

Defines a standard of mapping asset relationships.

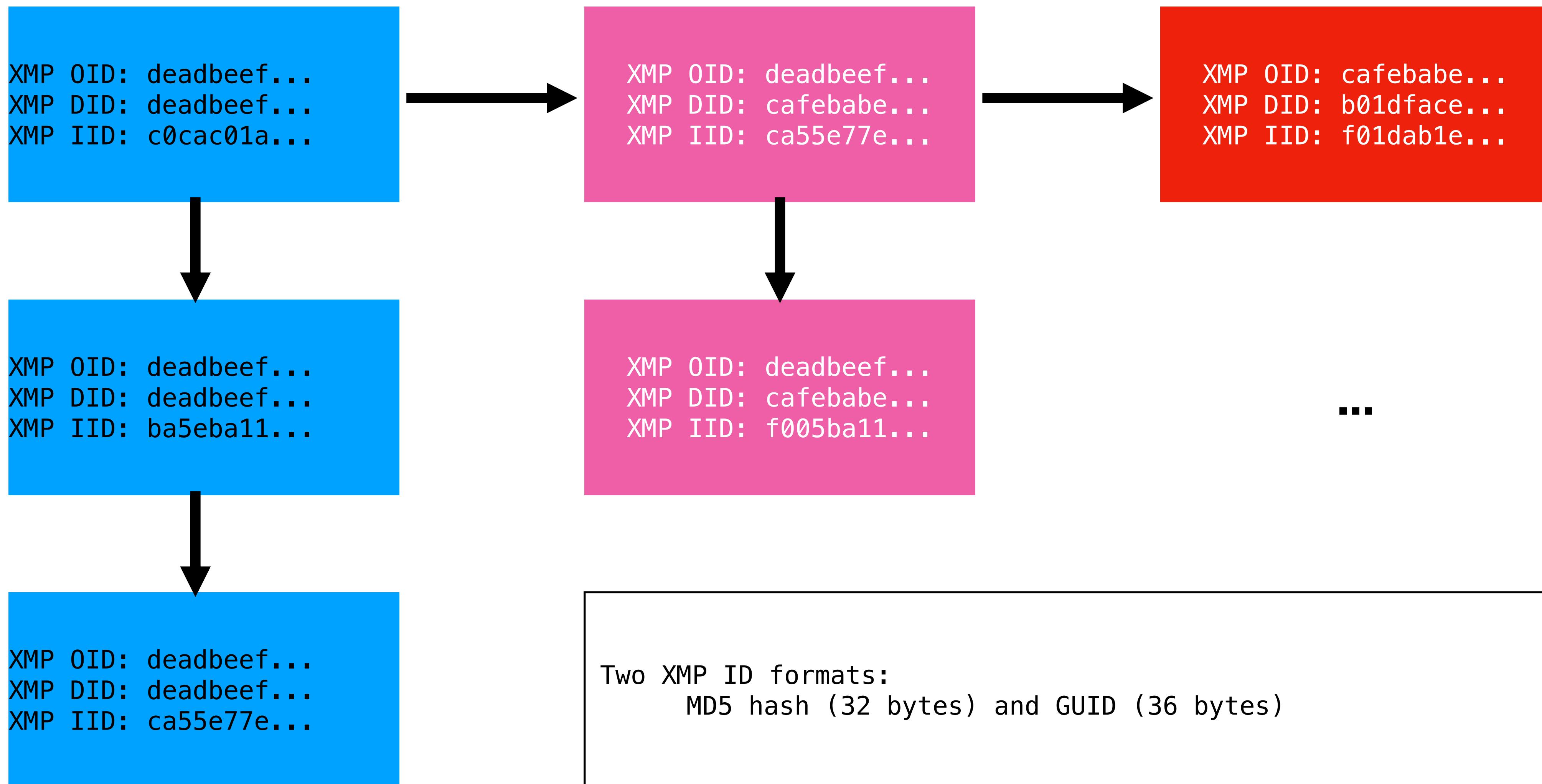
XML parent-to-child and revision tracking.

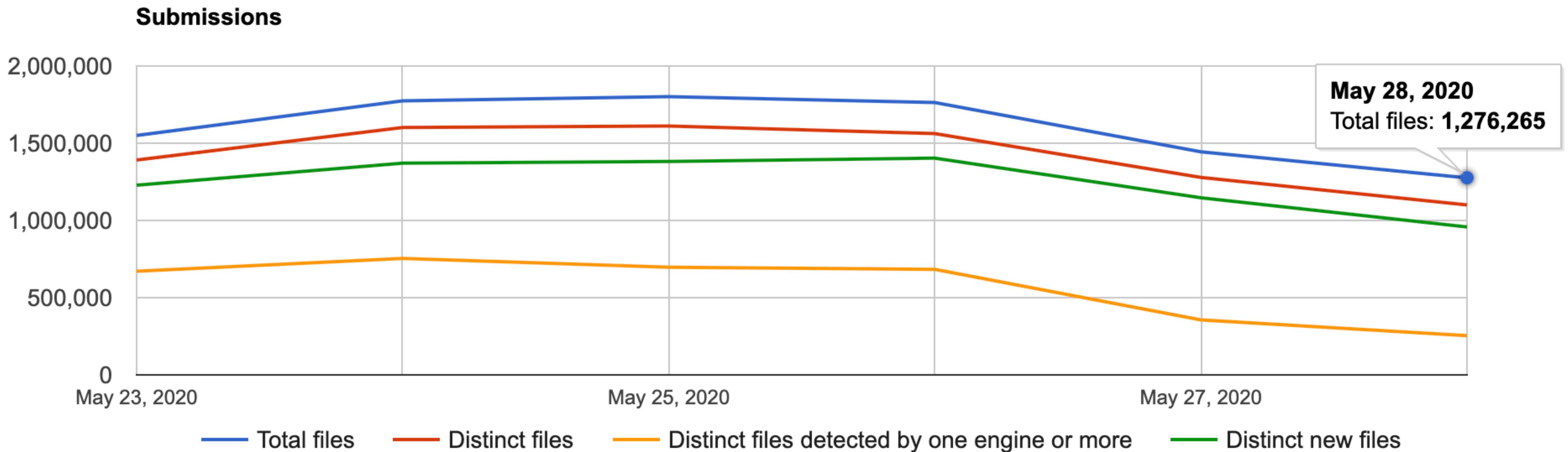
Original (OID), Document (DID), and Instance (IID).

Data updated on save/copy and embedded within the asset.



XMP ID Family Trees

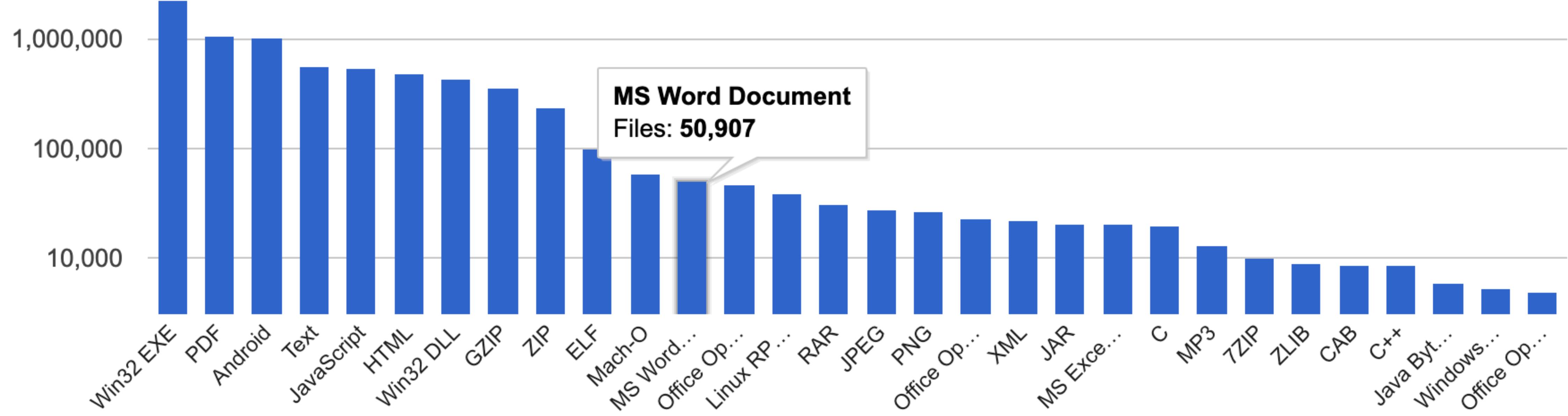




VTI: Daily Uploads

~1.3M total < ~1M distinct < ~900k new < ~400k malicious

File types



VTI: File Distribution

~1M PDF < ~50k Office < ~20k Java < ~15k Excel...



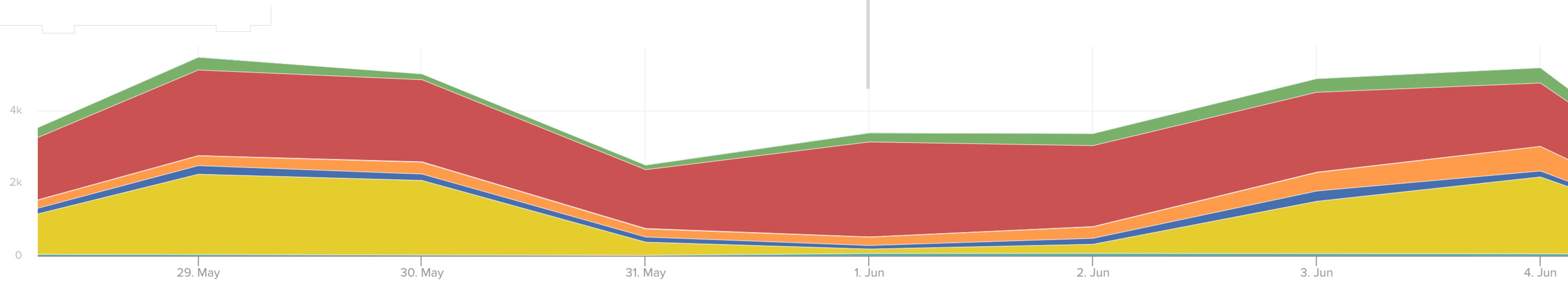
Reducing the Volume

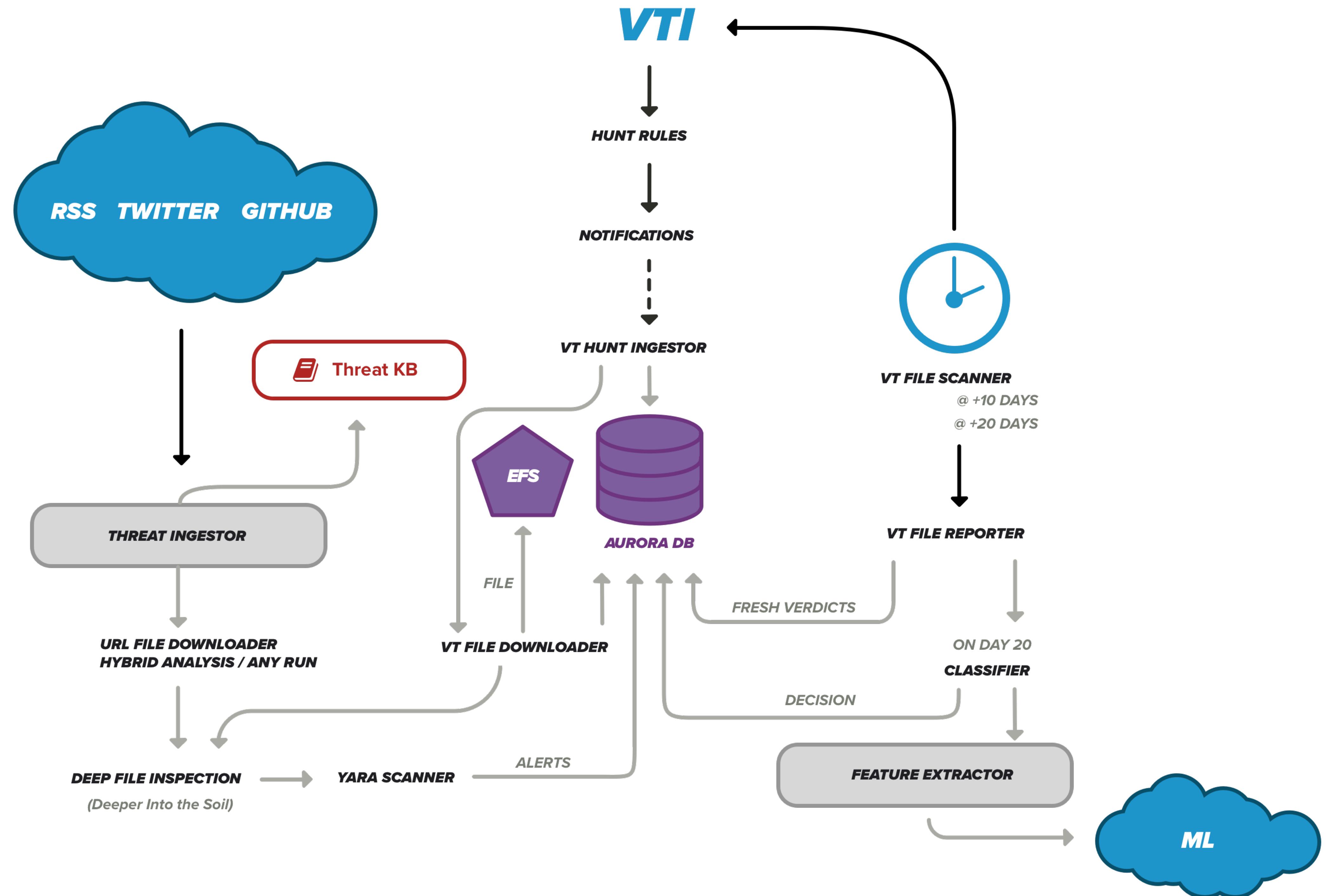


- <https://github.com/InQuest/yara-rules>
- Layered carriers, Matryoshka:
- Evasive characteristics.
- ~5k samples a day, <1%.
- Clustering...

Thu Jun 4 00:00:00

● research.vt_hunt_ingestor.phish_hunter	2,113
● research.vt_hunt_ingestor.maldoc_hunter	1,743
● research.vt_hunt_ingestor.maljar_hunter	675
● research.vt_hunt_ingestor.macro_hunter	419
● research.vt_hunt_ingestor.pdfjs_hunter	164
● research.vt_hunt_ingestor.rtf_hunter	53
● research.vt_hunt_ingestor.swfdoc_hunter	12
● research.vt_hunt_ingestor.malflash_hunter	3







Burning Your Warez



- 🕵️ MIME evasions ... "{\rt" vs "{\rtf1" ... "%PDF" not at 0.
- 👨 Burning your 0day via symbols:
"shellcode", "exploit", "heapspray", etc.
- 💣 UTF-8 Byte Order Mark (BOM), 0xEFBBBF, from 2013!
- 🌽 Chaff...

prst="rect"><a:avLst/></a:prstGeom><a:noFill/><a:ln><a:noFill/></a:ln></pic:spPr></pic:pic> ▶ <[^>]+> Aa Ab * 111 of 985 ← → ⌂ ×

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relativeFrom="page"><wp14:pctHeight>0</wp14:pctHeight></wp14:sizeRelV></wp:anchor></w:drawing><w:r w:rsidR="00513FA3"

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w:rsidR="0043037A"><w:rPr><w:b/></w:rPr><w:instrText>sixflags-frightfest.com/ticket-ids scrobj.dll" "For Security Reasons" </w:instrText></w:r><w:r w:rsidR="00513FA3" w:rsidRPr="00591163"><w:rPr><w:b/></w:rPr><w:instrText xml:space="preserve">

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relativeFrom="page"><wp14:pctWidth>0</wp14:pctWidth></wp14:sizeRelH><wp14:pctHeight>0</wp14:pctHeight></wp14:sizeRelV>

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w:rPr="00591163"><w:rPr><w:b/></w:rPr><w:instrText xml:space="preserve">DDEAUTO </w:instrText>

w:rPr="0043037A"><w:rPr><w:b/></w:rPr><w:instrText>"C</w:instrText>

w:rPr="0043037A"><w:rPr><w:b/></w:rPr><w:instrText>:\</w:instrText>

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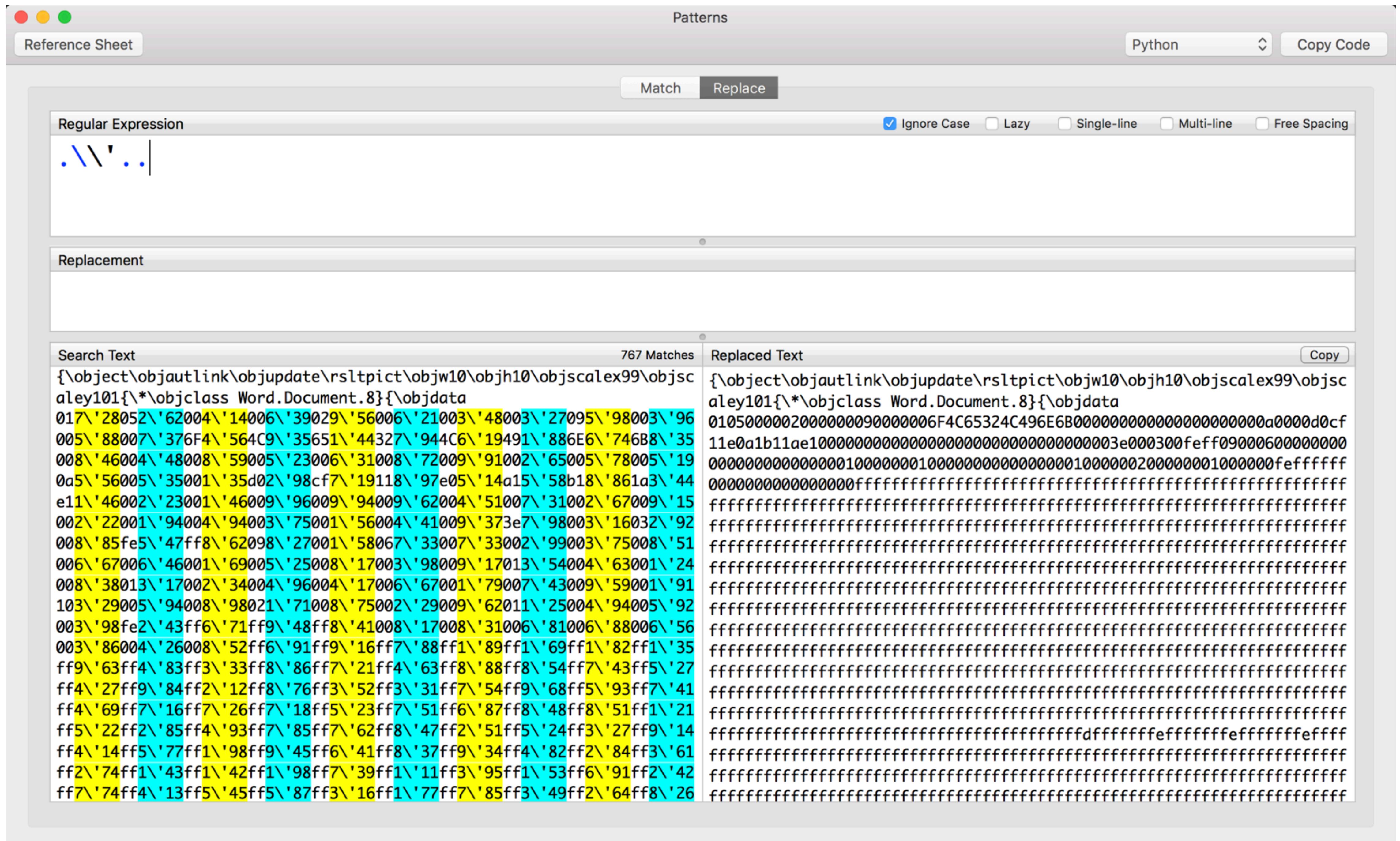
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Burning Your Warez



- 🕵️ MIME evasions ... "{\rt" vs "{\rtf1" ... "%PDF" not at 0.
- 👤 Burning your 0day via symbols:
"shellcode", "exploit", "heapspray", etc.
- 💣 UTF-8 Byte Order Mark (BOM), 0xEFBBBF, from 2013!
- 🌽 Chaff.
- 😱 RTF Byte-Nibble, utilized by CVE-2018-8174 ITW 0day...





Feature Selection



Data -> Features -> Algorithm(s)

ML models are primarily driven by the features you select.

The tunables per algorithm, can be "fuzzed" via grid search.

Our feature vector contains ~150 data points.

Split 75/25 between "visual" and semantic.



Bow and TF/IDF



Given a corpus of text, find all the unique tokens, jumble them together.

Rank the words by Term Frequency / Inverse Document Frequency (TF/IDF).

In other words, times the term is seen in a document vs all documents.

This text mining process can identify unique anchors for filtering.

Clustering

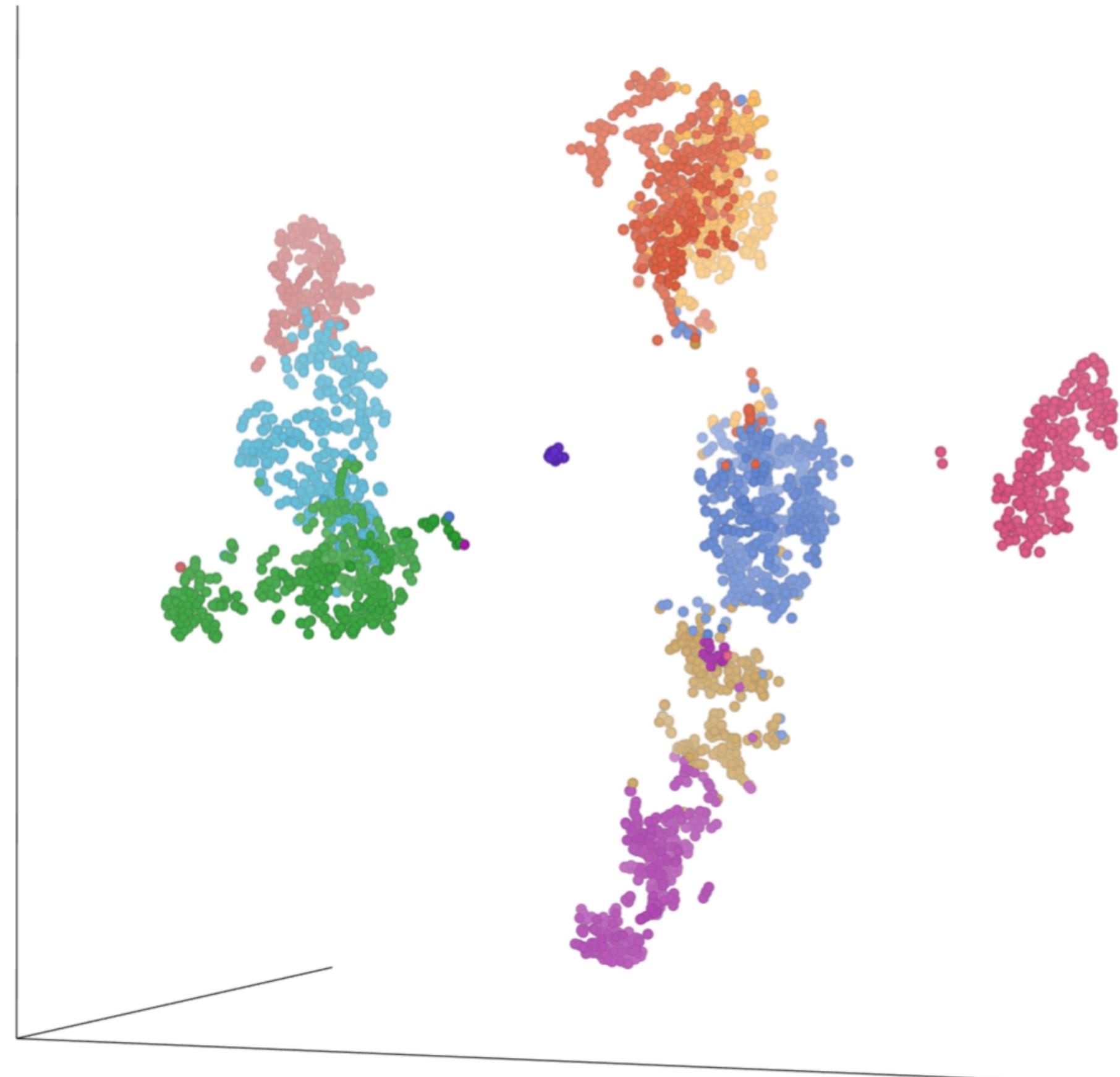
Inputs: Raw Macro and Feature Vector

Macro -> Bag-of-Words (BoW) -> TF/IDF

Macro hashing w/ SSDeep and TLSH.

K-Means (BoW and Features).

DBSCAN / OPTICS (BoW and Features).





Fuzzy Hashes

Context Triggered Piecewise Hash (CTPH), aka "fuzzy hashes".

SSDeep, the ubiquitous option and it's SQL query-able!

Trend Micro Locality Sensitive Hash (TLSH), the newer option, gaining traction, included in STIX v2.1.

Input is raw macro. Distance between samples is calculated.



You must choose a threshold for clustering.

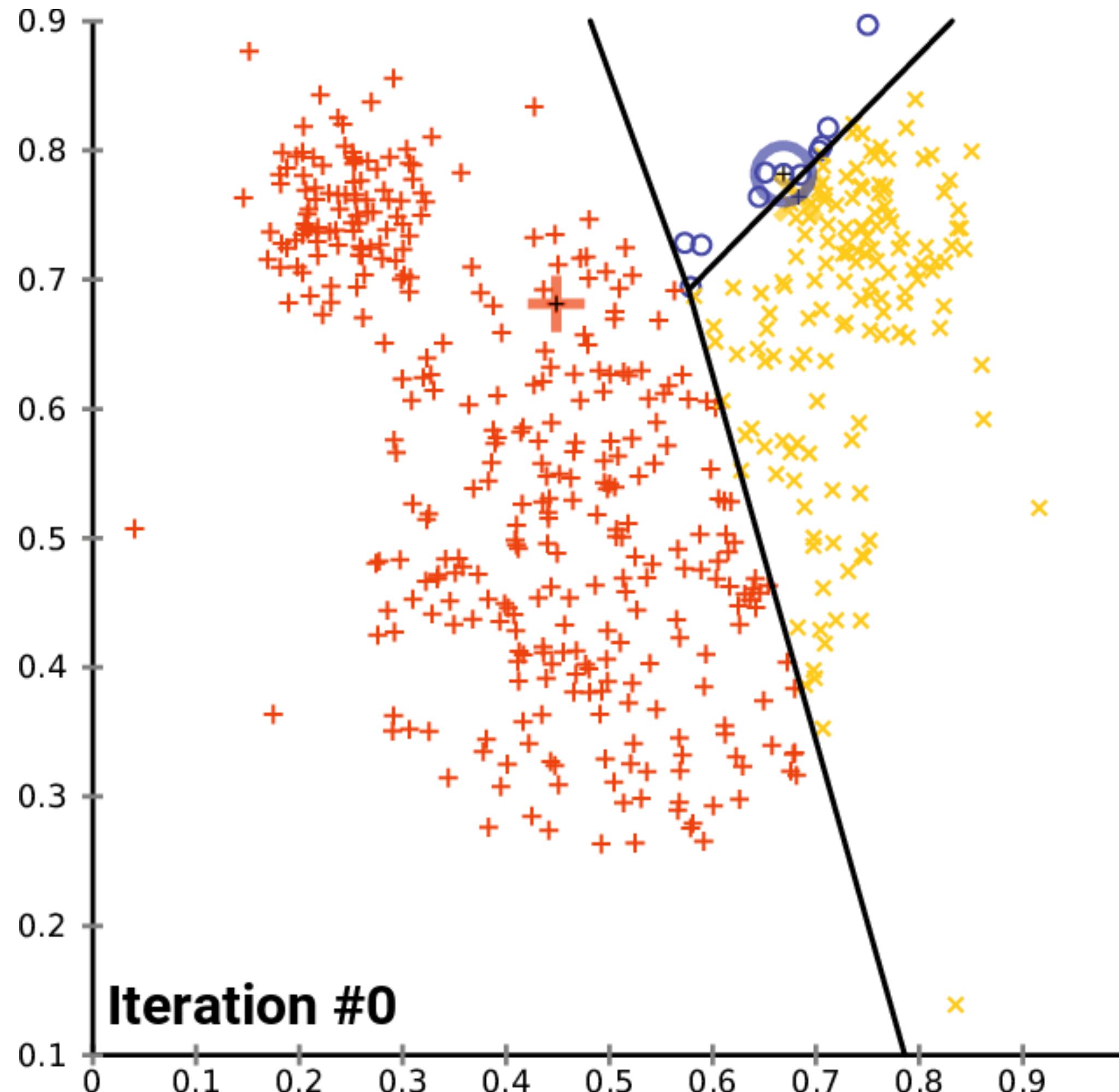
K-Means Clustering

1. Randomly choose dummy points, measure distance from dummy point to every other point.
2. Move the dummy points towards a denser area.
3. Repeat the process until improvements can not be made.

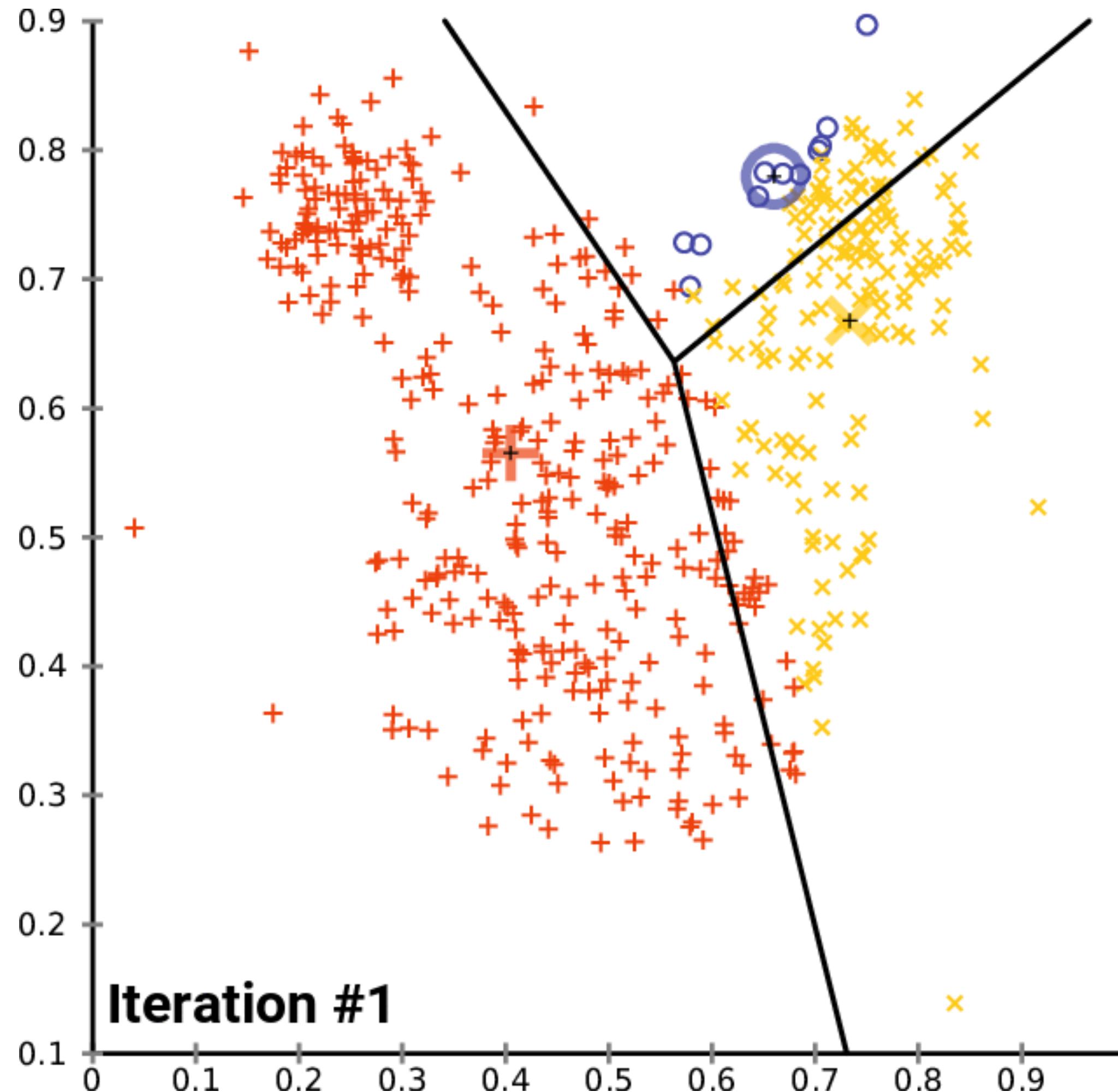


You must choose the number of clusters.

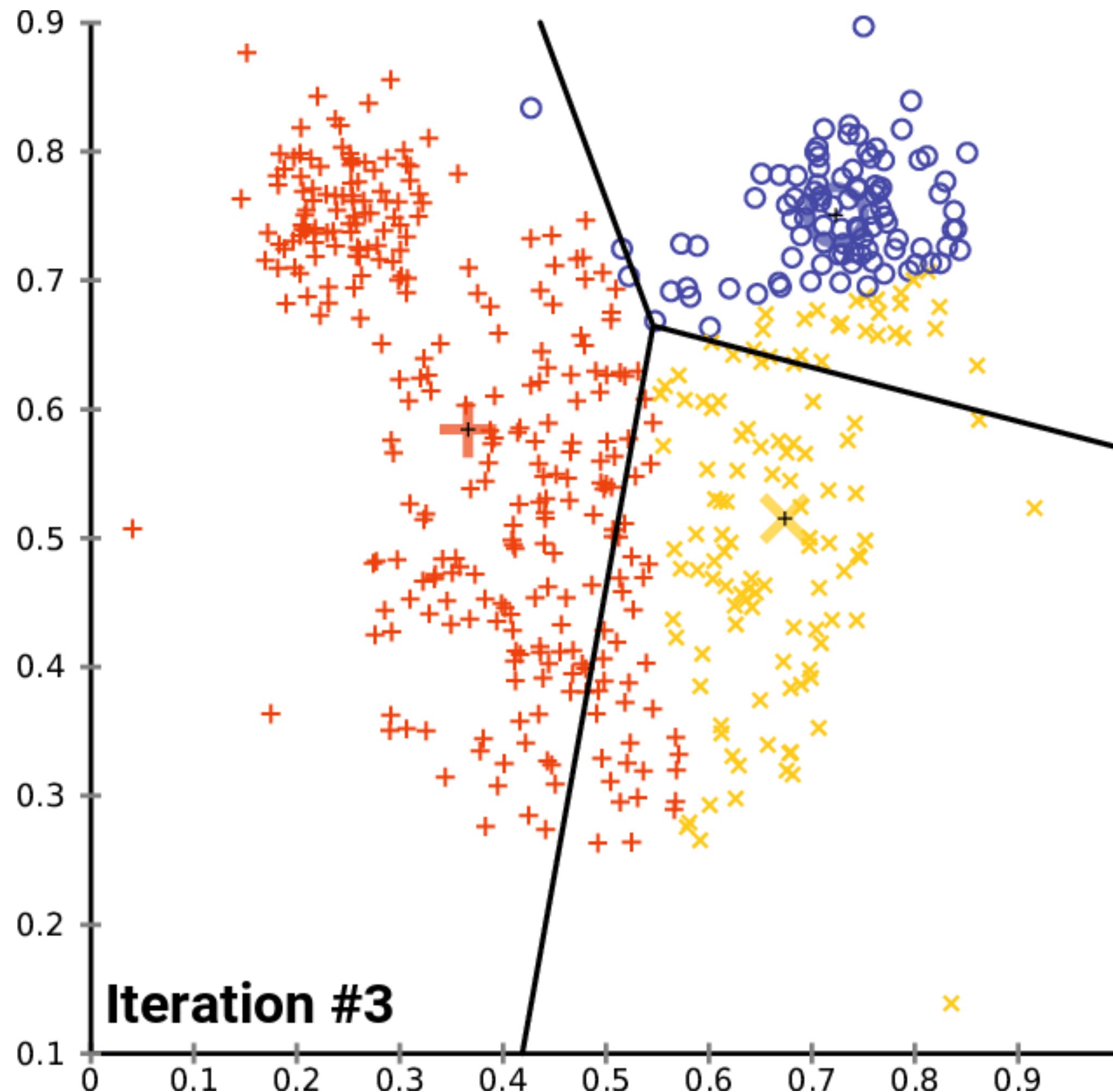
K-Means Clustering



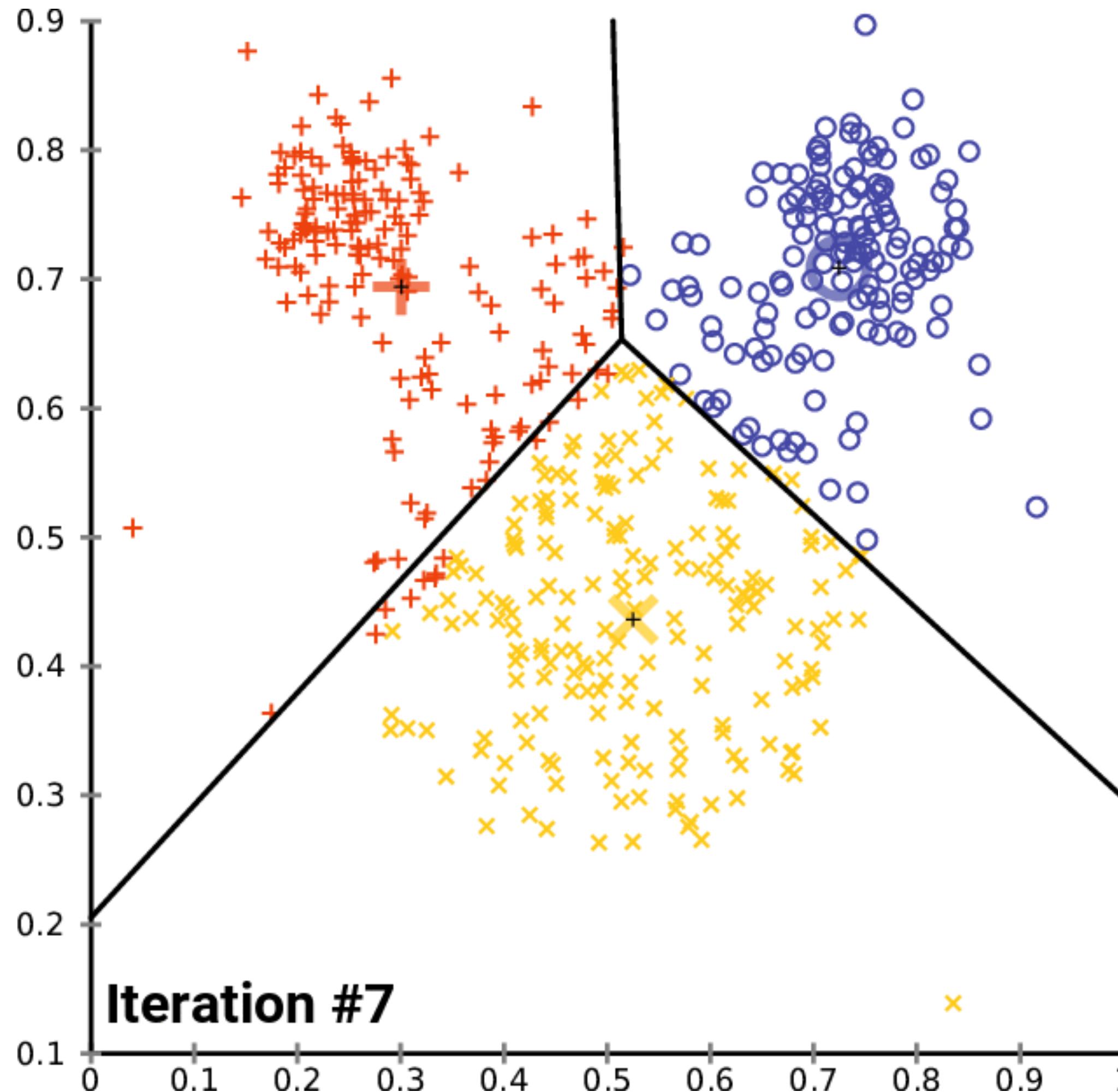
K-Means Clustering



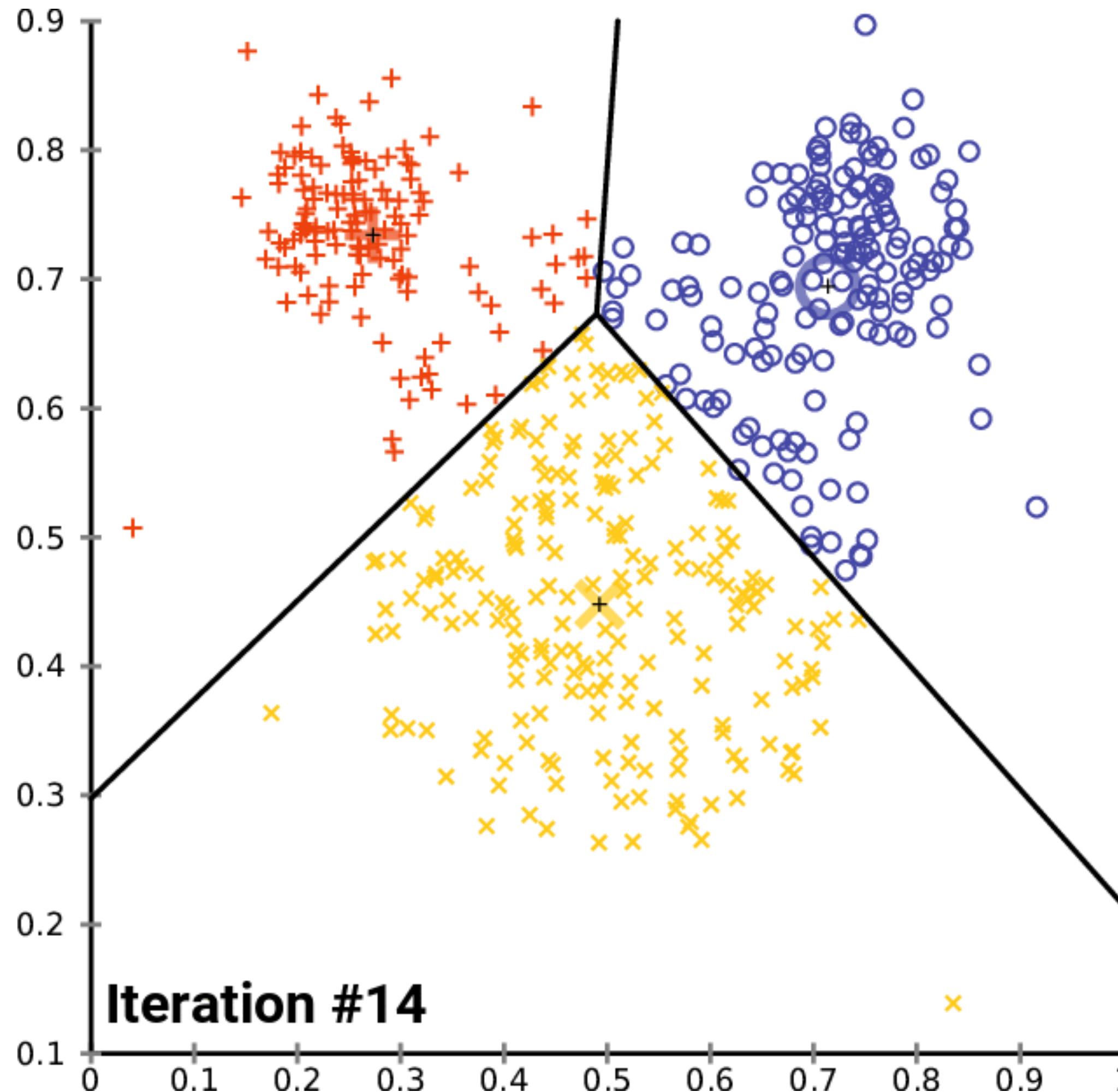
K-Means Clustering



K-Means Clustering



K-Means Clustering



DBSCAN / OPTICS

Density-Based Spatial Clustering of Applications with Noise (DBSCAN)

Ordering Points To Identify the Clustering Structure (OPTICS)

Uniform density-> DBSCAN, Varying density -> OPTICS.

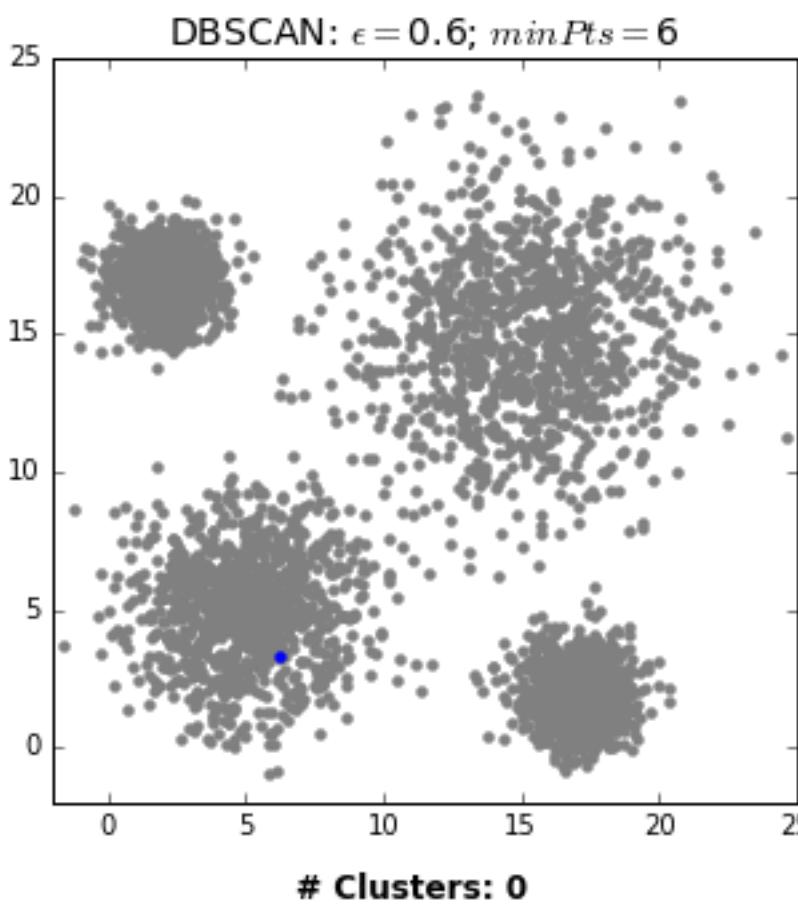
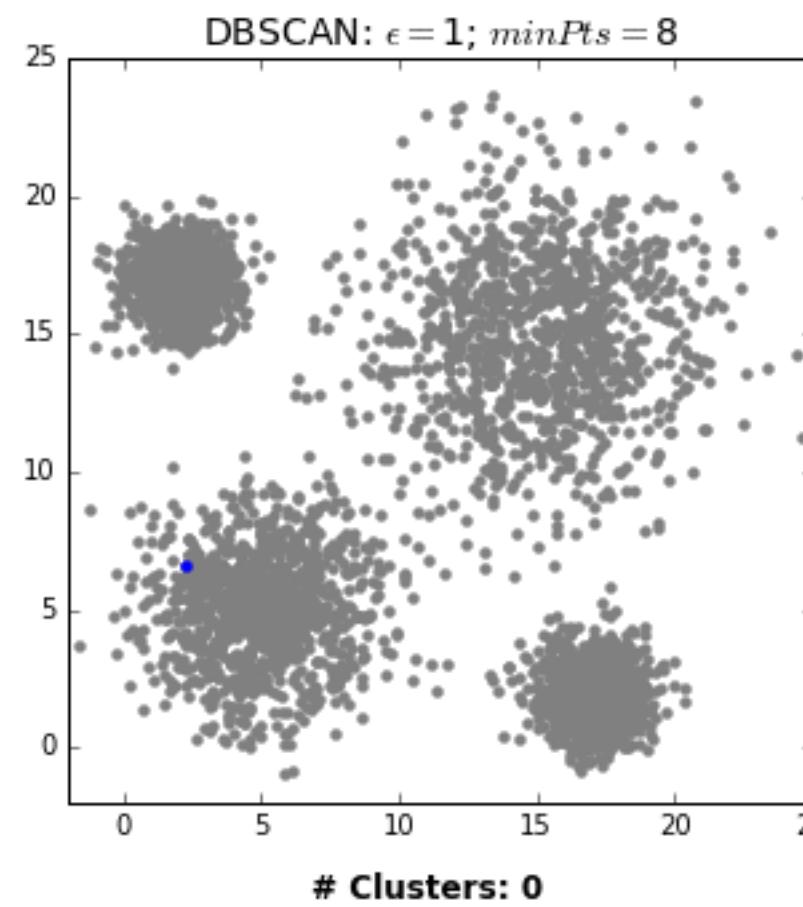
1. For each point, determine which other points live within epsilon distance.
2. If that number of points $> \text{min_points}$, then it's a "core point". Otherwise, it's an "edge point".
3. Points without neighbors are "noise".



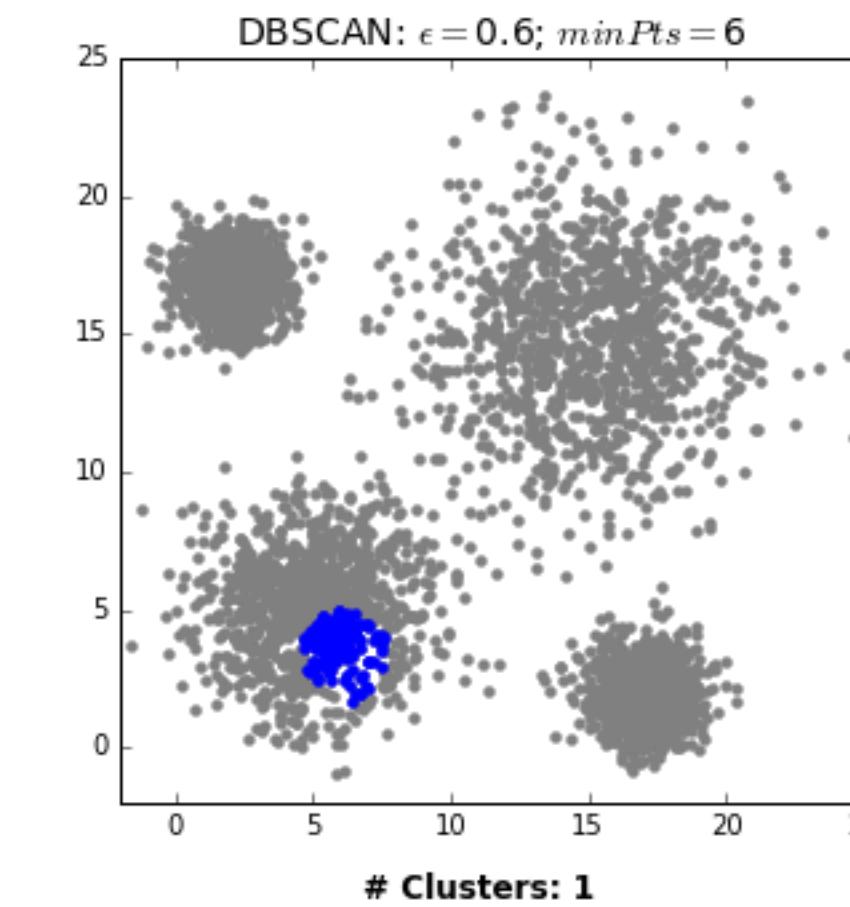
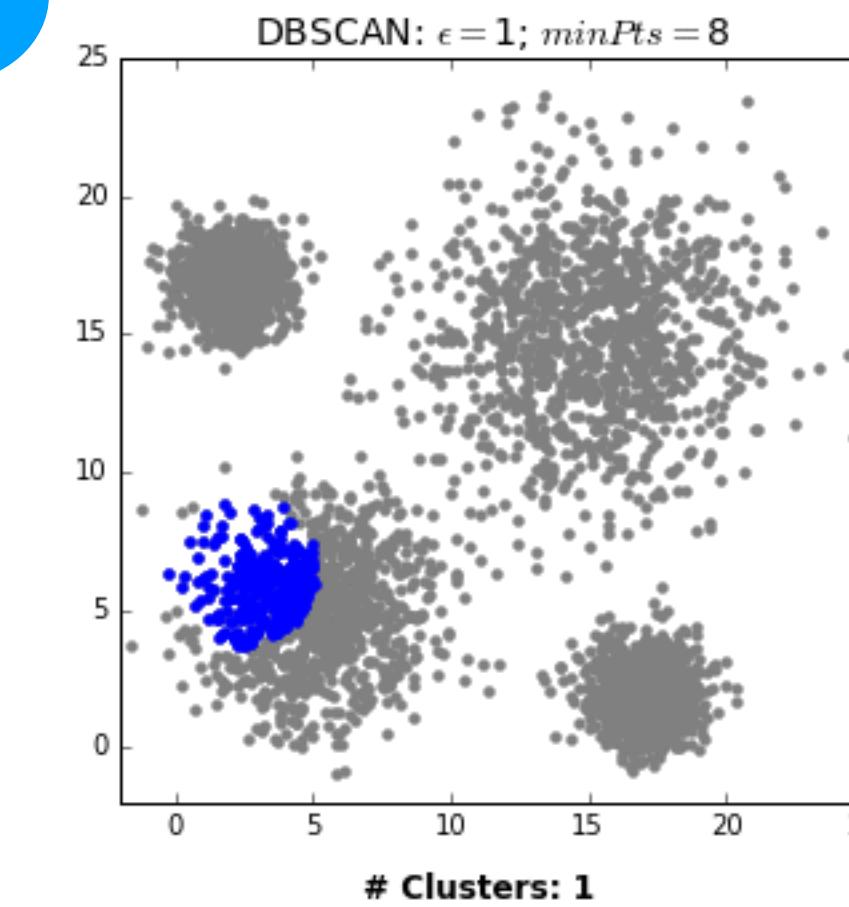
You must choose your epsilon and min_points threshold.

DBSCAN / OPTICS

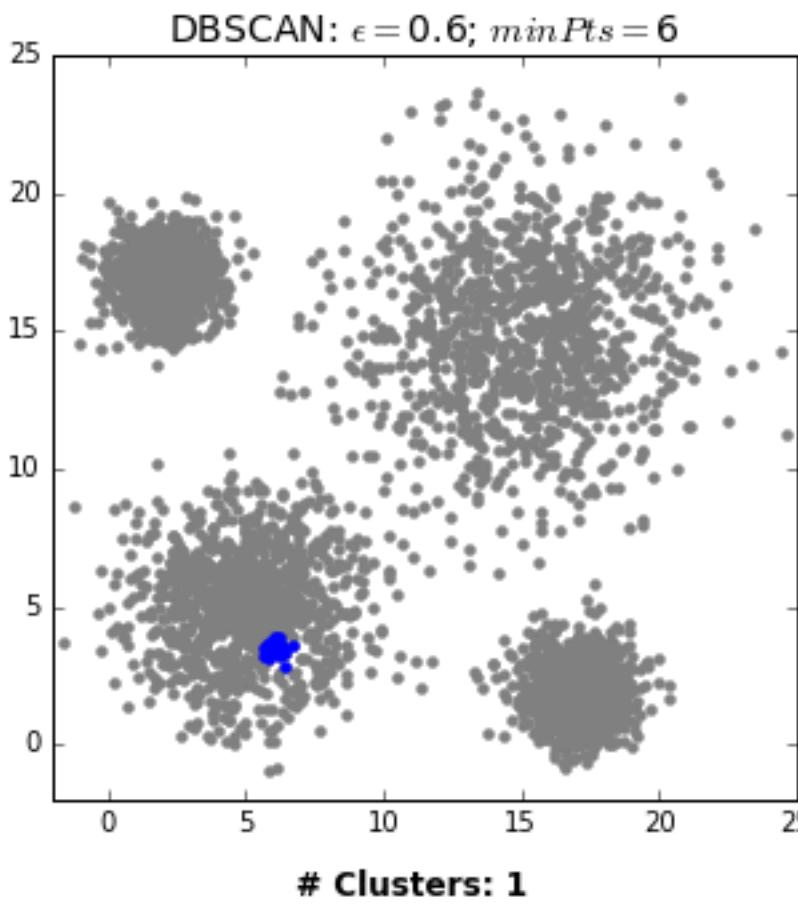
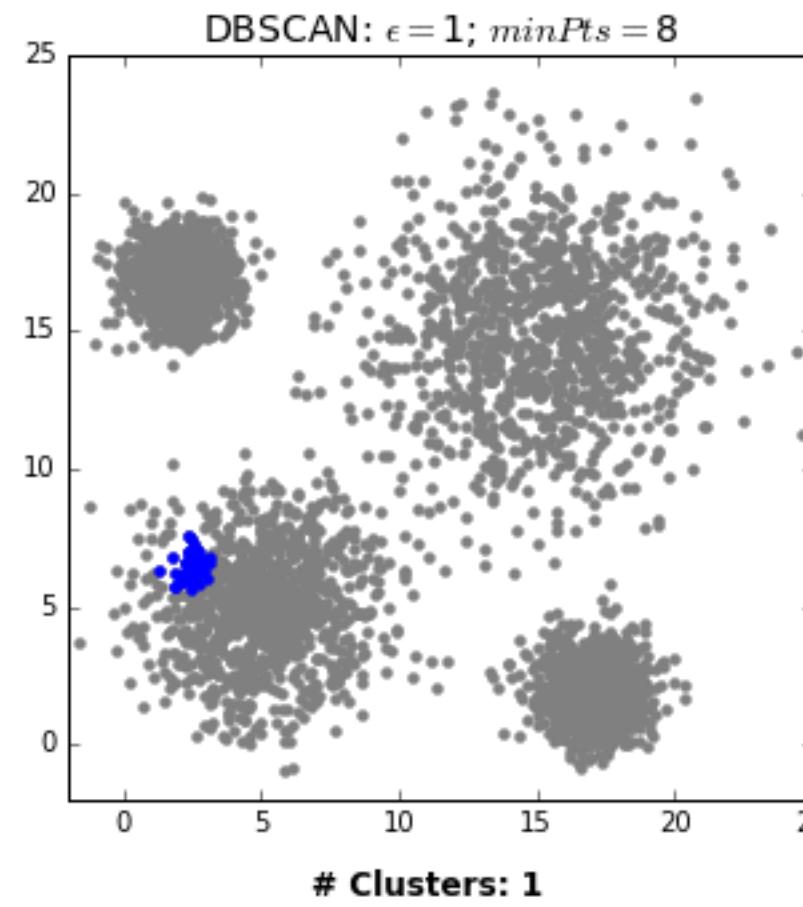
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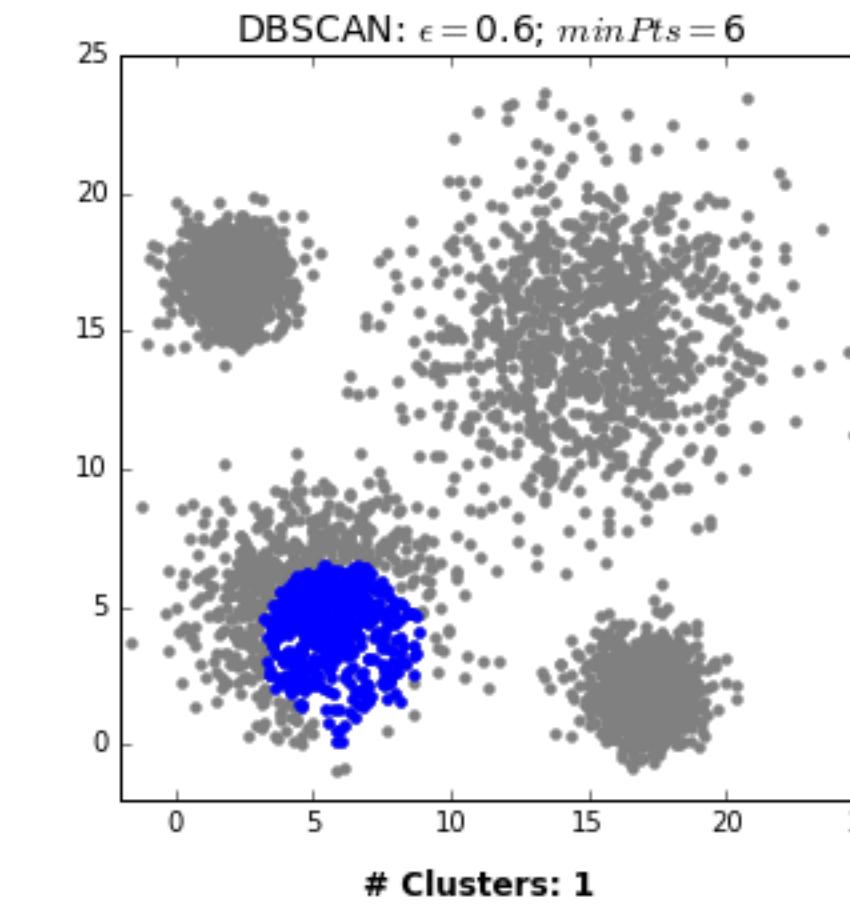
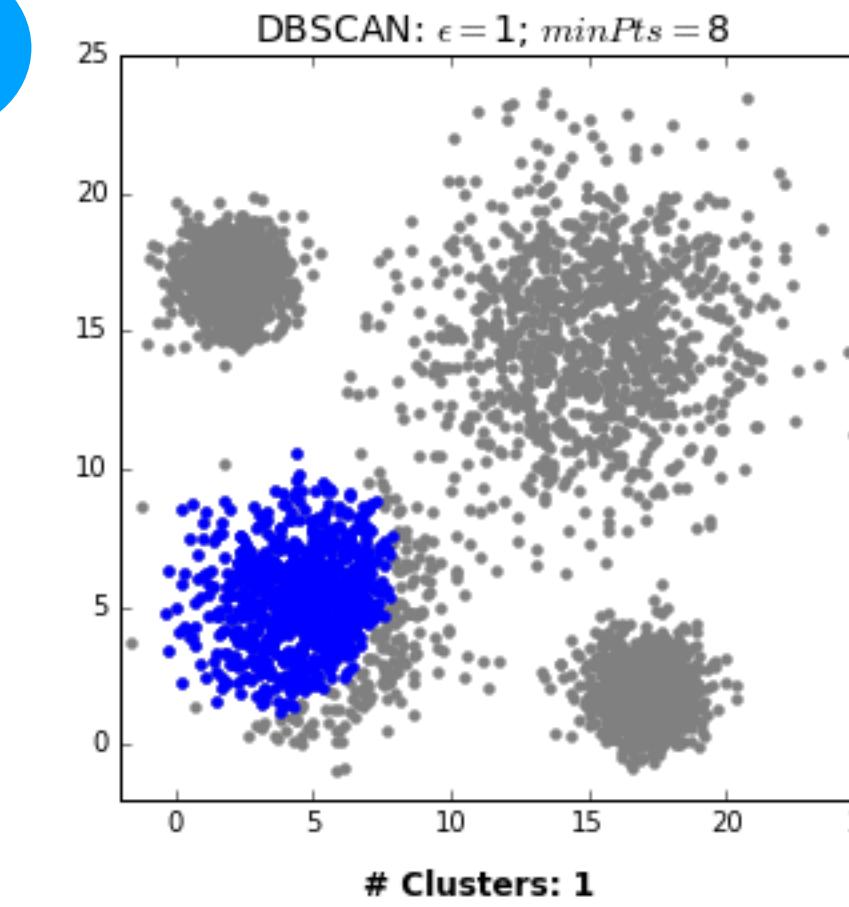
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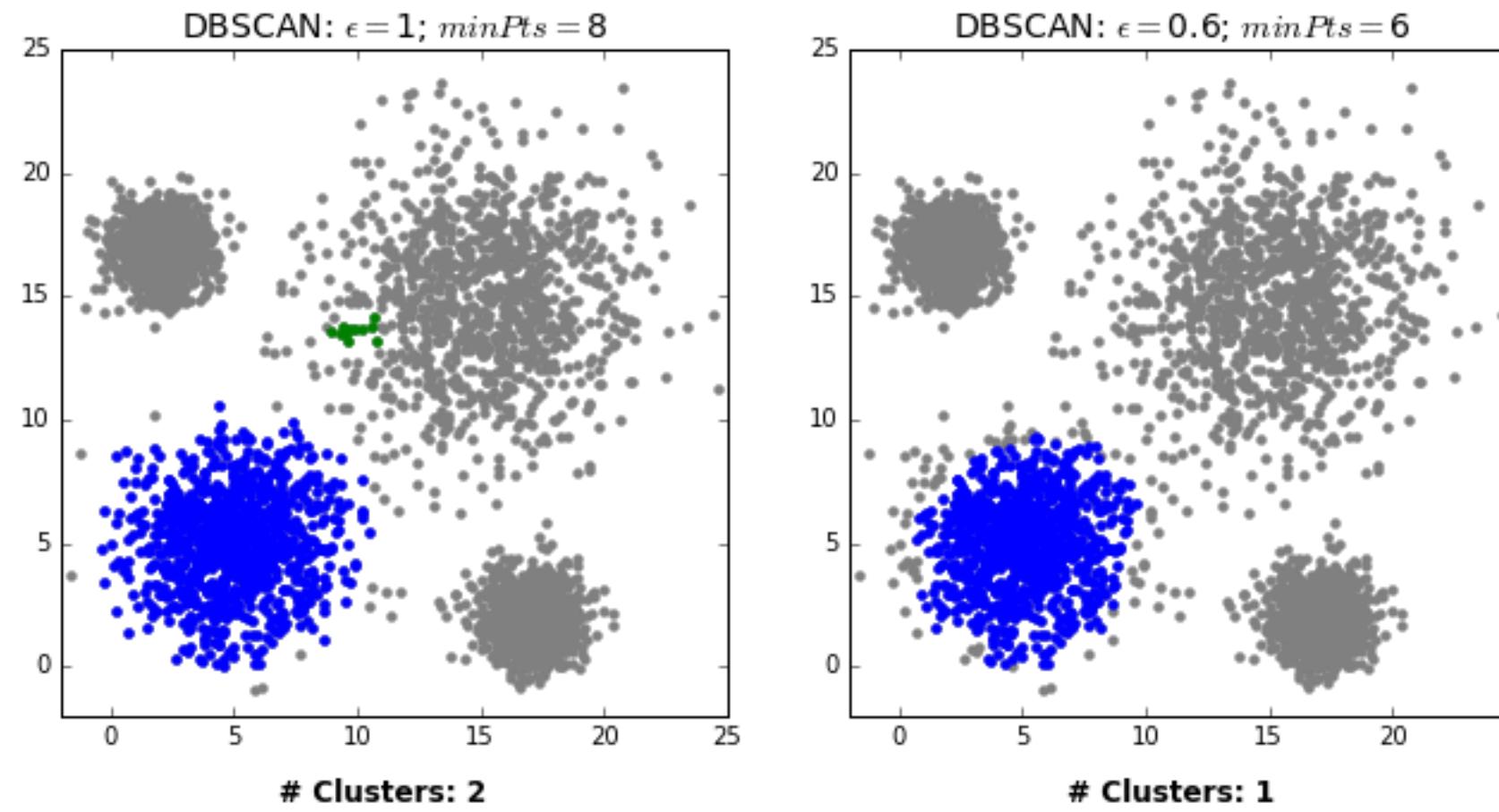


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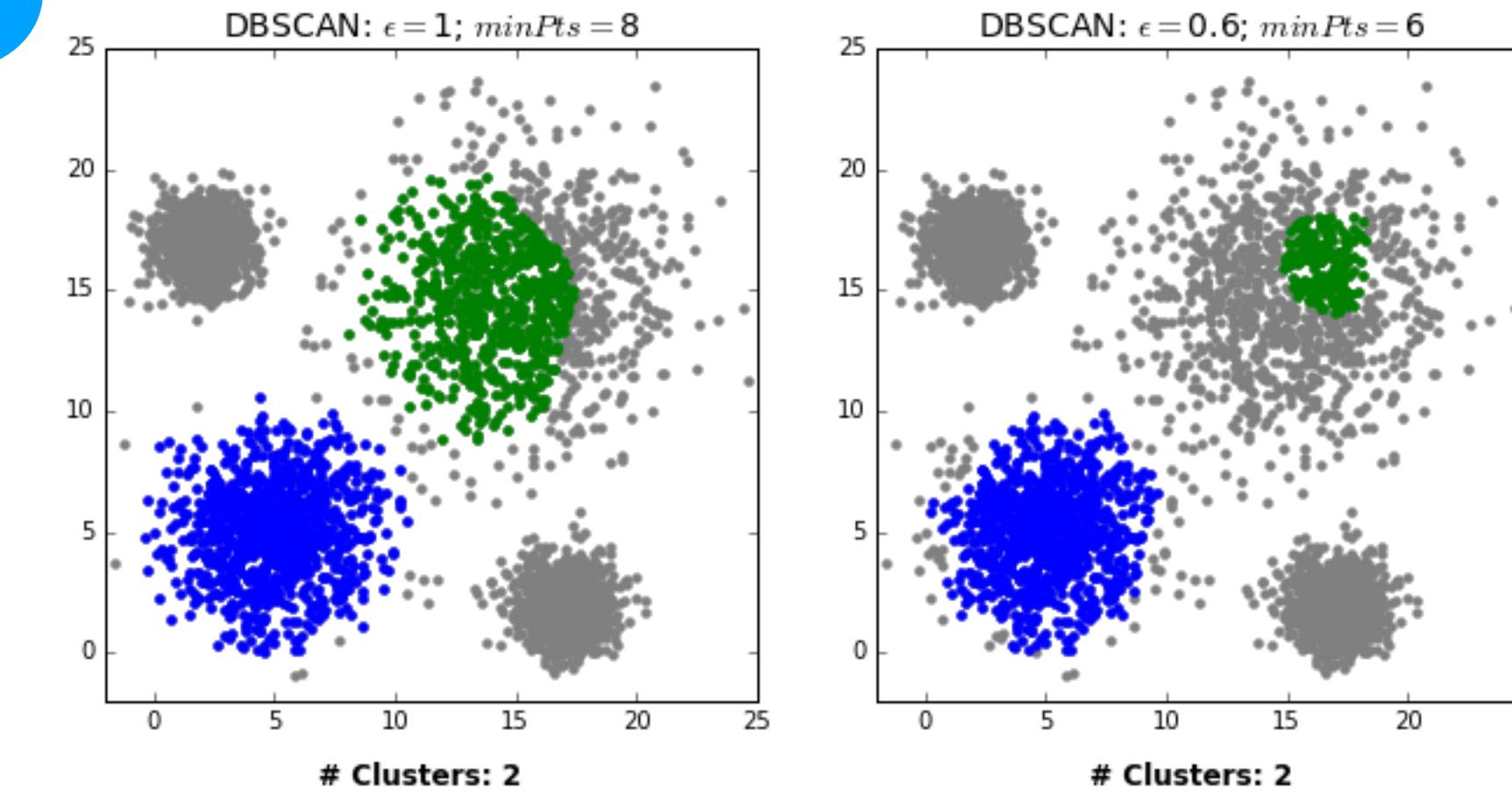


DBSCAN / OPTICS

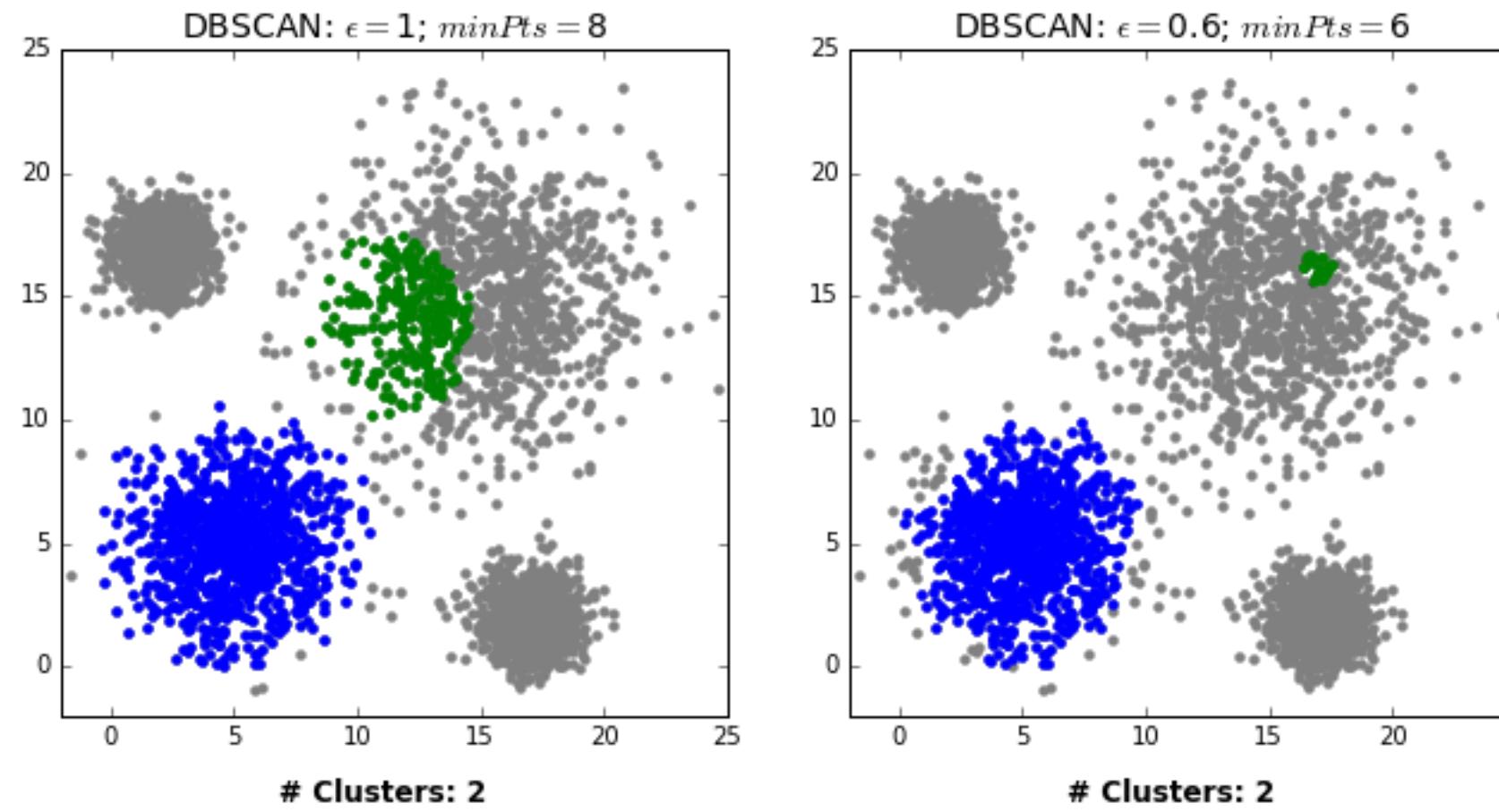
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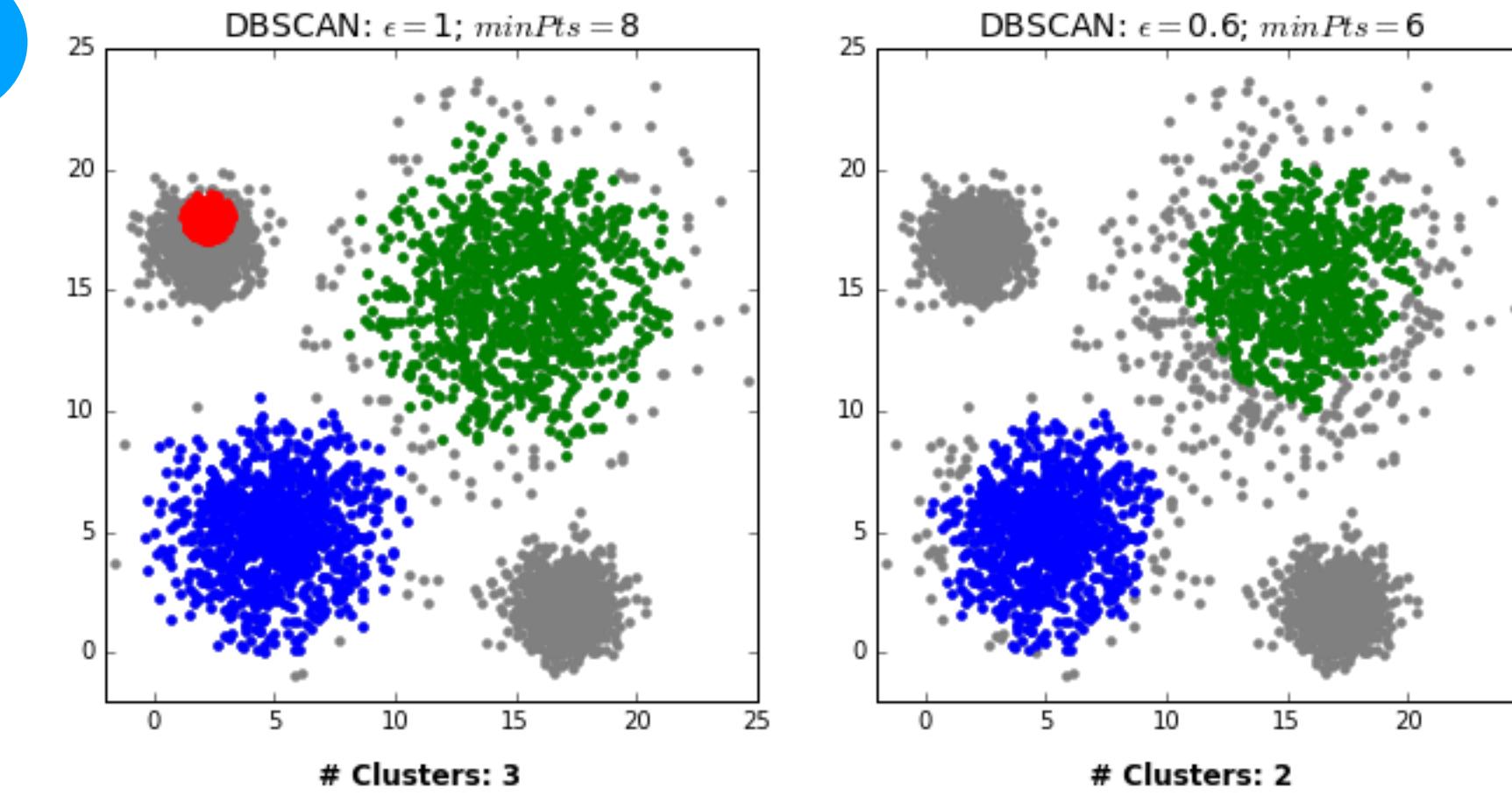
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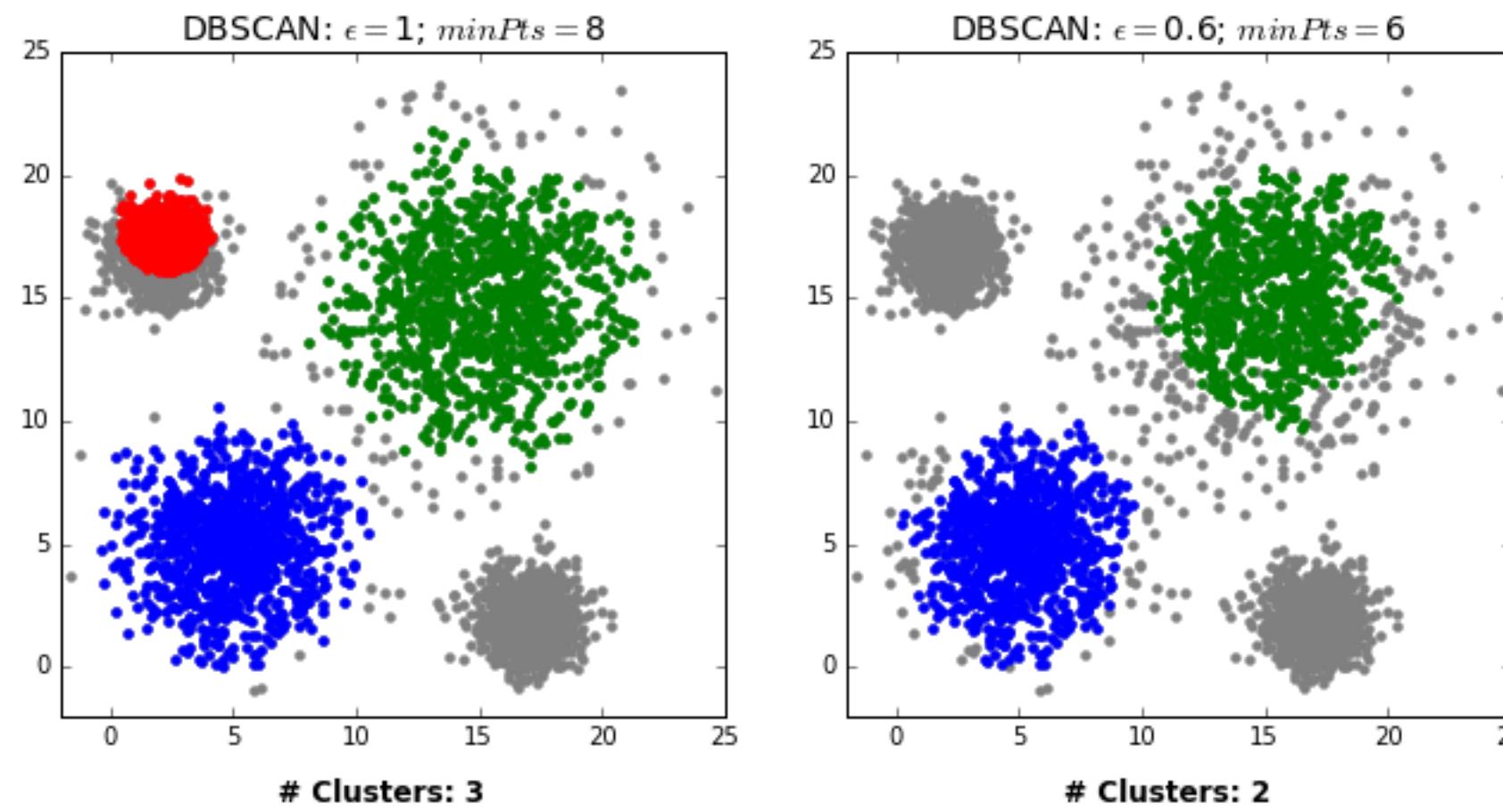


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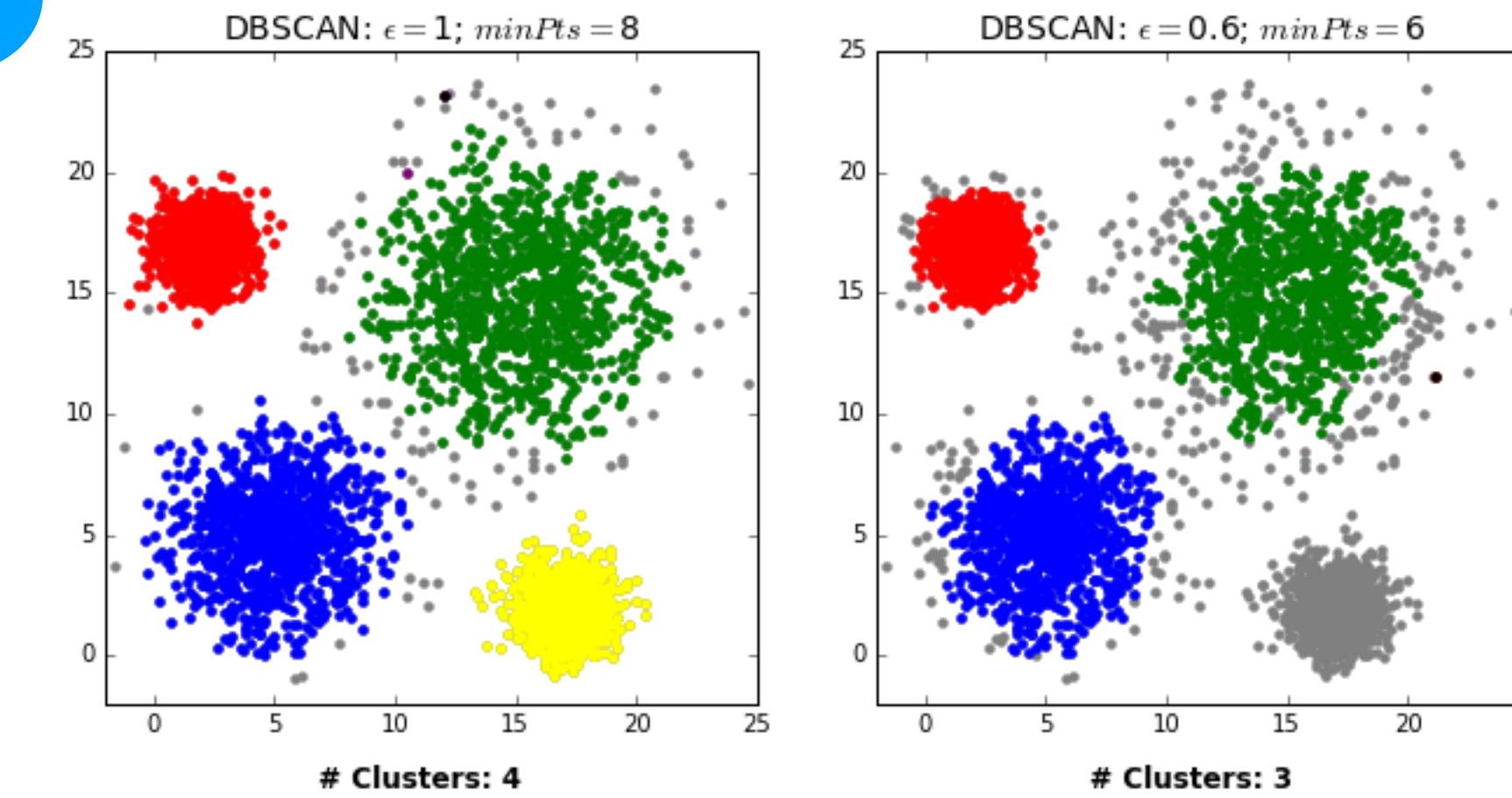


DBSCAN / OPTICS

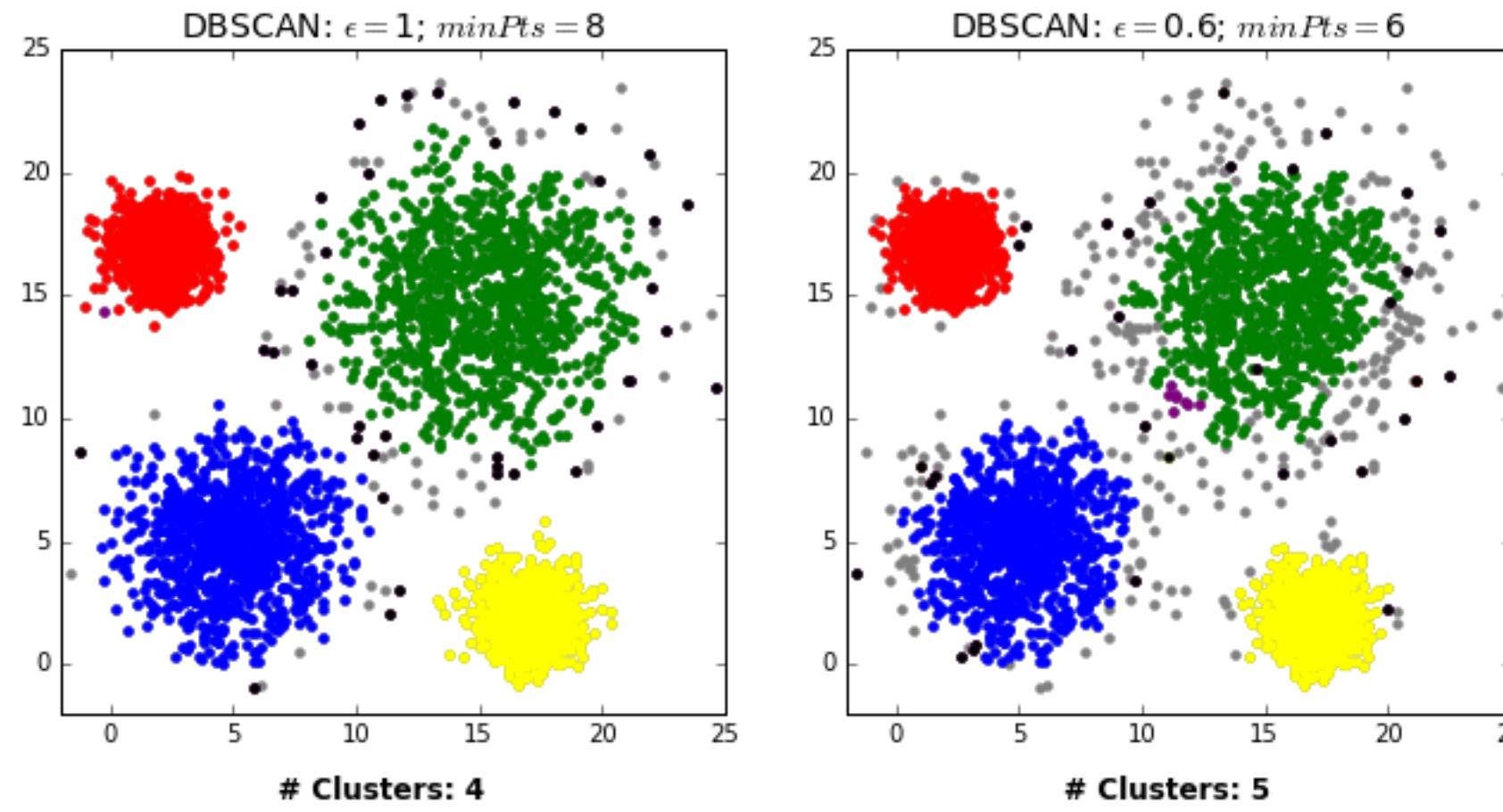
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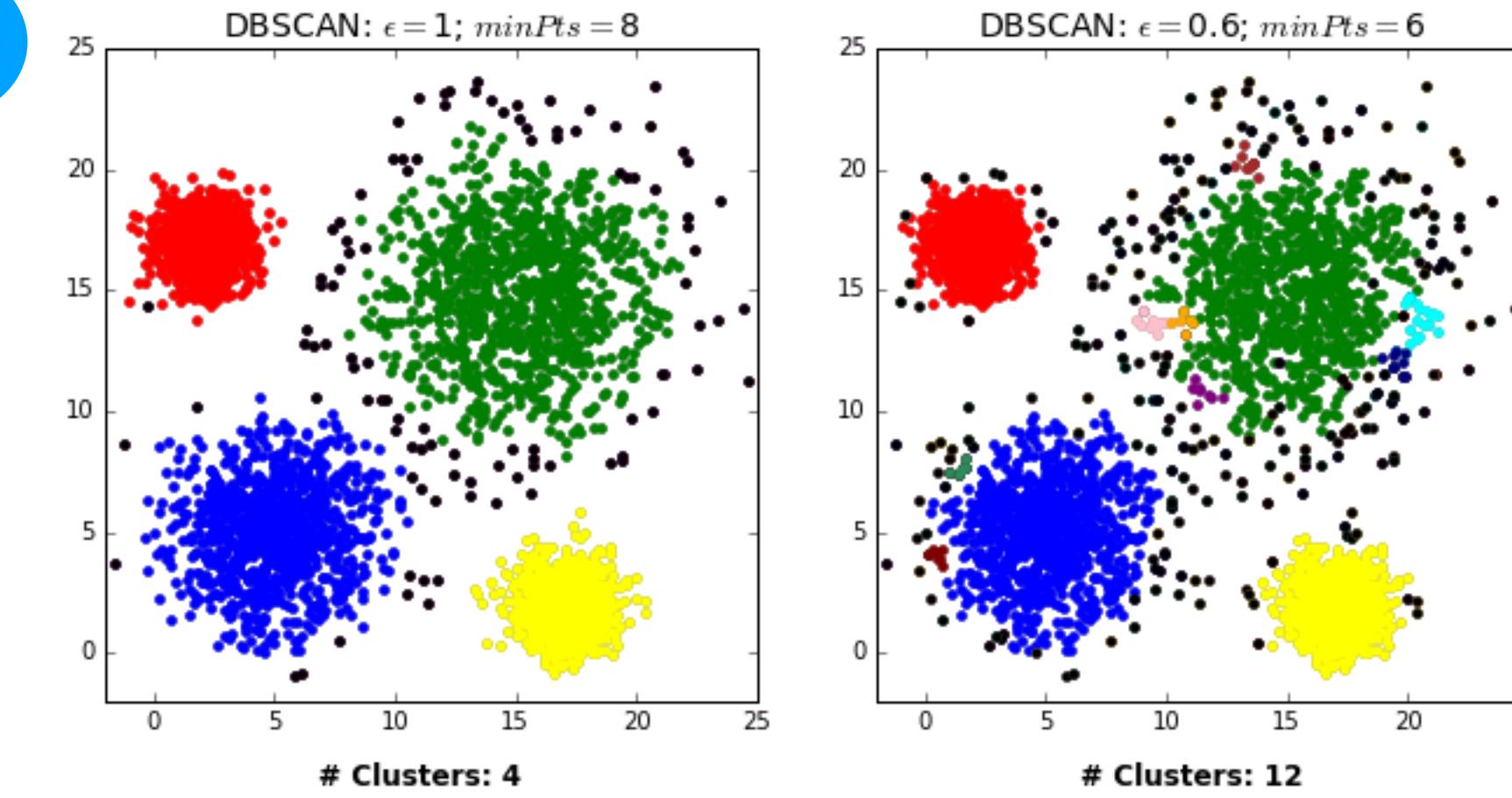
11



10



12



Clustering Results

Method	+Malicious	+Benign	Contribution
SSDeep	917	161	10.78%
TLSH	478	102	5.8%
K-Means-TFIDF	238	2	2.4%
K-Means-Features	285	3	2.88%
DBSCAN-TFIDF	795	4	7.99%
<i>DBSCAN-Features</i>	-	-	-
OPTICS-TFIDF	349	12	3.61%
OPTICS-Features	390	22	4.12%
Total / Unique	1789	95	18.84%

Corpus consists of 10,000 unique (macro hash) carrier documents, ~20% labeled.





Looking for Outliers



1. Discard the clusters.
2. Dynamic analysis, especially on bare metal.
3. Manual analysis with a focus on the suspect but undetected.

Identify an anchor and RetroHunt to expand the sample set.

Anchor's include: constant, asset, metadata, network header, etc.



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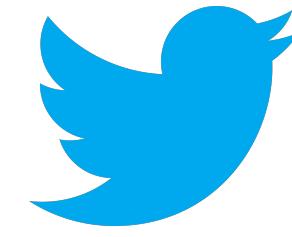
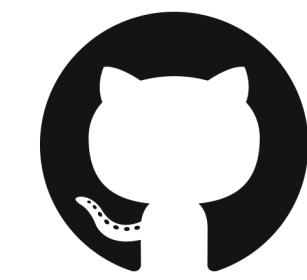
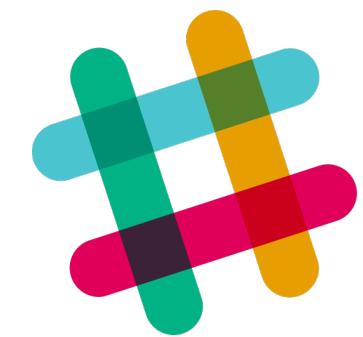


- Explore common carriers.
 - ~1M files in corpus.
- YARA helpers.
 - mIXeD HeX CaSe
 - uint() "triggers"
 - base64 regex generator
- Reputation aggregation
 - ~25 open sources
- IOC aggregation
 - Twitter, RSS, Github...
- Open API
- *Cluster data impending...*

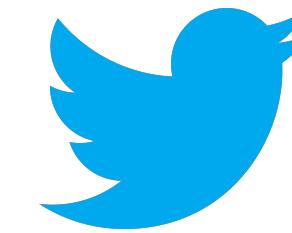
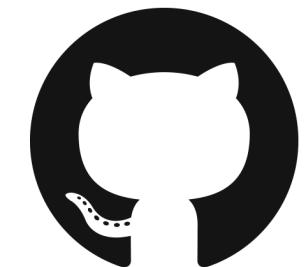
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