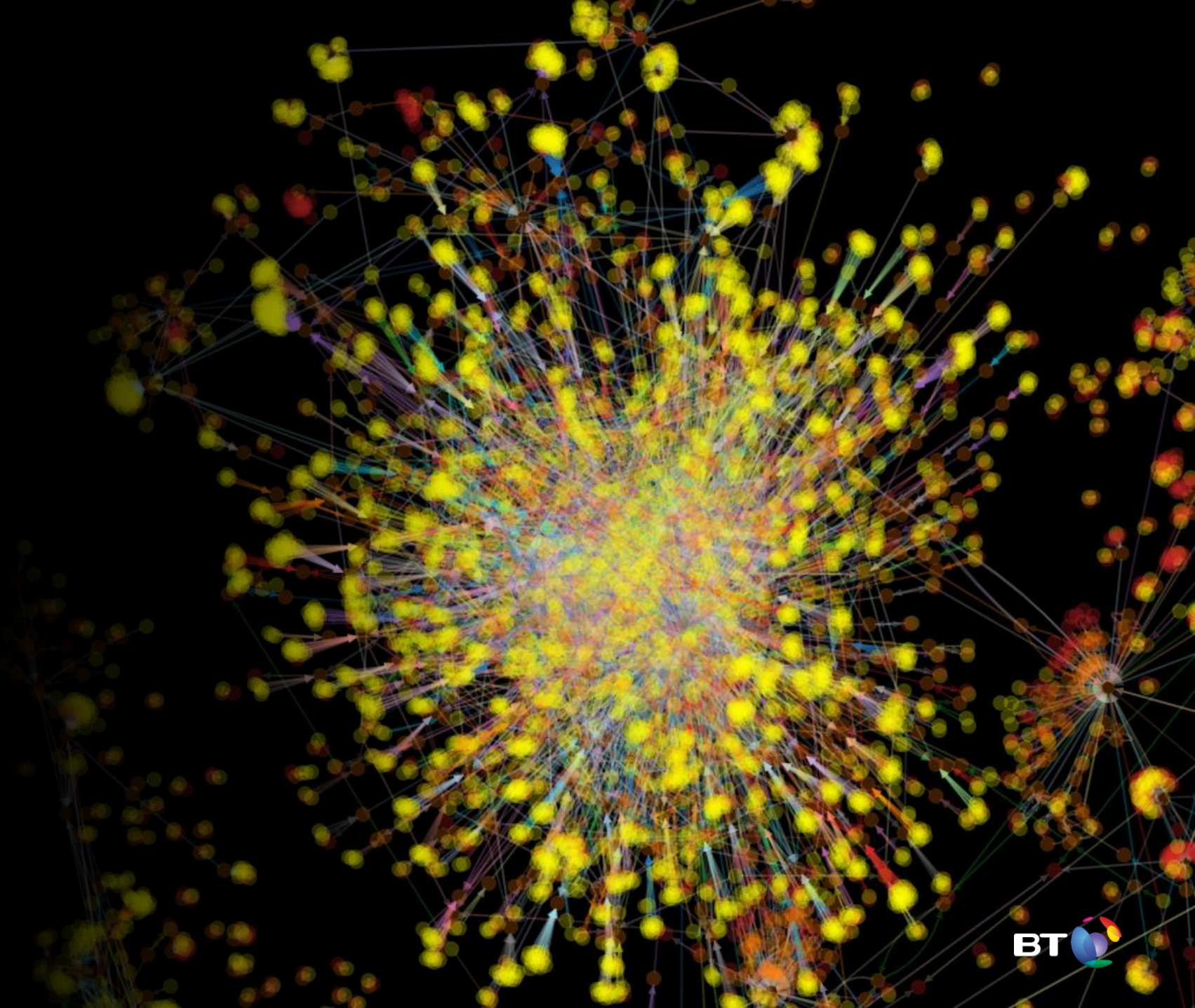


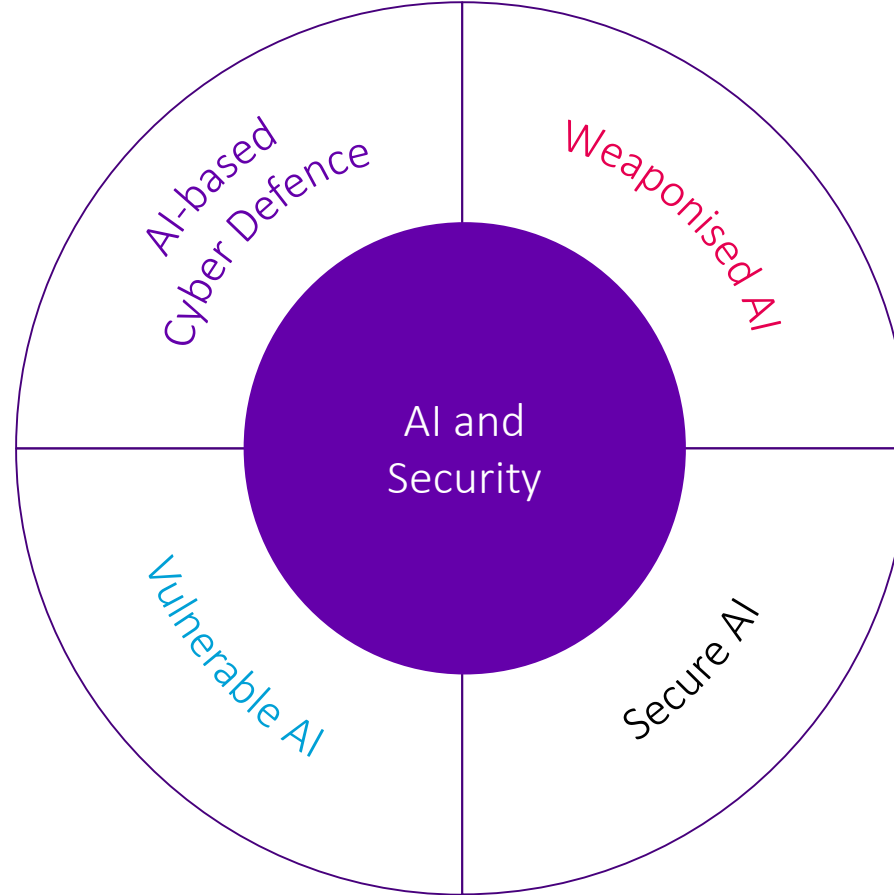
Security in AI

Alex Healing

Senior Research Manager
BT Applied Research



AI and Security



Oops, your important files are encrypted.

If you see this text, then your files are no longer accessible, because they have been encrypted. Perhaps you are busy looking for a way to recover your files, but don't waste your time. Nobody can recover your files without our decryption service.

We guarantee that you can recover all your files safely and easily. All you need to do is submit the payment and purchase the decryption key.

Please follow the instructions:

1. Send \$300 worth of Bitcoin to following address:

1Mz7153HMuxXTuR2R1t78MGSdzaAtNbBWx

2. Send your Bitcoin wallet ID and personal installation key to e-mail wowsmith123456@posteo.net. Your personal installation key:

74f296-2Nx1GM-yHQRWr-S8gaN6-8Bs1td-U2DKui-ZZpKJE-kE6sSN-o8tizU-gUeUMa

If you already purchased your key, please enter it below.

Key: _

2011/08/18 10:19:43.145825	2.866238	udp	11.33.51.38	52612	<->	147.32.84.229	13363	CON	0	0	4	1068	144	flow=Background-UDP-Established
2011/08/18 10:19:43.171088	3532.122070	tcp	95.153.187.126	5404	<?>	147.32.84.229	13363	PA_PA	0	0	450	40640	21796	flow=Background
2011/08/18 10:19:43.176541	0.000588	udp	95.158.130.106	28690	<->	147.32.84.229	13363	CON	0	0	2	140	80	flow=Background-UDP-Established
2011/08/18 10:19:43.191231	38.653095	tcp	147.32.85.60	49097	<?>	147.32.80.13	80	FA_FA	0	0	6	396	198	flow=To-Background-CVUT-Proxy
2011/08/18 10:19:43.201918	3031.119873	udp	109.242.218.20	35270	<->	147.32.84.229	13363	CON	0	0	4	270	150	flow=Background-UDP-Established
2011/08/18 10:19:43.240092	1980.079346	udp	212.5.201.67	21244	<->	147.32.84.229	13363	CON	0	0	4	535	335	flow=Background-UDP-Established
2011/08/18 10:19:43.250992	0.000621	udp	83.228.27.39	55175	<->	147.32.84.229	13363	CON	0	0	2	135	75	flow=Background-UDP-Established
2011/08/18 10:19:43.280231	3570.269043	udp	147.32.84.229	13363	<->	114.37.208.113	41554	CON	0	0	114	18571	9155	flow=Background-UDP-Established
2011/08/18 10:19:43.280238	2458.203125	tcp	147.32.84.229	443	<?>	130.235.44.203	2843	FPA_FPA	0	0	142	12542	5116	flow=Background
2011/08/18 10:19:43.282470	3570.854004	tcp	147.32.87.2	636	?>	147.32.86.34	49791	PA	0	0	80	24190	24190	flow=Background
2011/08/18 10:19:43.282910	3570.603760	icmp	147.32.87.1	0x0105	->	147.32.87.2	0x9320	RED	0	0	8	560	560	flow=Background
2011/08/18 10:19:43.341900	3021.396484	udp	207.231.93.17	40081	<->	147.32.84.229	13363	CON	0	0	4	270	150	flow=Background-UDP-Established
2011/08/18 10:19:43.351110	245.170105	tcp	147.32.85.60	60668	<?>	147.32.80.13	80	FPA_FPA	0	0	17	1271	662	flow=To-Background-CVUT-Proxy
2011/08/18 10:19:43.375448	0.000825	udp	83.71.35.0	23159	<->	147.32.86.165	12114	CON	0	0	2	161	68	flow=Background-UDP-Established
2011/08/18 10:19:43.377839	3071.732910	udp	80.235.193.228	6222	<->	147.32.84.229	13363	CON	0	0	10	1215	905	flow=Background-UDP-Established
2011/08/18 10:19:43.393859	0.000690	udp	79.140.162.14	37775	<->	147.32.84.229	13363	CON	0	0	2	549	71	flow=Background-UDP-Established
2011/08/18 10:19:43.396291	3558.509766	udp	79.124.20.26	12509	<->	147.32.84.229	13363	CON	0	0	16	2453	1858	flow=Background-UDP-Established
2011/08/18 10:19:43.411748	272.750488	tcp	147.32.84.59	51354	->	209.85.148.103	443	SRPA_FSPA	0	0	413	417486	28987	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.447011	3567.131348	udp	87.204.181.98	51321	<->	147.32.84.229	13363	CON	0	0	62	16229	14369	flow=Background-UDP-Established
2011/08/18 10:19:43.467063	525.599304	tcp	147.32.84.59	51069	<?>	66.220.158.32	80	FPA_FPA	0	0	40	17814	3416	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.477060	525.588989	tcp	147.32.84.59	51009	<?>	66.220.158.32	80	FPA_FPA	0	0	40	17757	3388	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.487775	0.000771	udp	24.0.200.132	27436	<->	147.32.84.229	13363	CON	0	0	2	551	74	flow=Background-UDP-Established
2011/08/18 10:19:43.497647	21.906412	tcp	147.32.84.59	53592	->	86.63.194.248	80	SRPA_FSPA	0	0	19	11386	857	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.497832	11.908697	tcp	147.32.84.59	53593	->	86.63.194.248	80	FSA_FSA	0	0	6	368	246	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.498062	11.908592	tcp	147.32.84.59	53594	->	86.63.194.248	80	FSA_FSA	0	0	6	368	246	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.498484	0.011636	tcp	147.32.84.59	53595	->	86.63.194.232	80	SRPA_FSPA	0	0	10	3804	794	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.517270	3421.022461	udp	212.8.163.101	37743	<->	147.32.84.229	13363	CON	0	0	40	6248	1530	flow=Background-UDP-Established
2011/08/18 10:19:43.537743	3209.289307	tcp	85.135.126.34	1153	<?>	147.32.84.229	13363	PA_PA	0	0	331	39868	26190	flow=Background
2011/08/18 10:19:43.552971	0.015314	tcp	147.32.84.59	53596	->	86.63.194.232	80	SRPA_FSPA	0	0	10	3735	787	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.560527	0.382046	tcp	147.32.84.59	53597	->	86.63.194.236	80	SRPA_FSPA	0	0	9	1638	1038	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.560822	11.846376	tcp	147.32.84.59	53598	->	86.63.194.236	80	FSA_FSA	0	0	6	368	246	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.561411	0.000560	udp	91.203.67.131	44253	<->	147.32.86.165	12114	CON	0	0	2	128	60	flow=Background-UDP-Established
2011/08/18 10:19:43.561418	0.769482	udp	210.59.152.30	57694	<->	147.32.84.229	13363	CON	0	0	6	398	213	flow=Background-UDP-Established
2011/08/18 10:19:43.578358	0.510875	tcp	147.32.84.59	53599	->	195.168.10.171	80	SRPA_FSPA	0	0	36	37170	1873	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.578590	0.546980	tcp	147.32.84.59	53600	->	195.168.10.171	80	SRPA_FSPA	0	0	13	7374	1591	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.578788	0.745894	tcp	147.32.84.59	53601	->	195.168.10.171	80	SRPA_FSPA	0	0	13	7600	1592	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.609873	0.000685	udp	78.141.179.11	34017	<->	147.32.84.229	13363	CON	0	0	2	639	85	flow=Background-UDP-Established
2011/08/18 10:19:43.616505	0.000926	udp	61.40.69.59	11605	<->	147.32.84.229	13363	CON	0	0	2	1034	137	flow=Background-UDP-Established
2011/08/18 10:19:43.619862	1724.208984	udp	88.80.118.206	20049	<->	147.32.84.229	13363	CON	0	0	10	2000	1513	flow=Background-UDP-Established
2011/08/18 10:19:43.620713	0.000347	udp	147.32.84.138	46829	<->	147.32.80.9	53	CON	0	0	2	214	81	flow=To-Background-UDP-CVUT-DNS-Server
2011/08/18 10:19:43.620765	0.000348	udp	147.32.84.138	55792	<->	147.32.80.9	53	CON	0	0	2	214	81	flow=To-Background-UDP-CVUT-DNS-Server
2011/08/18 10:19:43.621567	3592.656006	tcp	147.32.84.59	49170	->	205.188.10.202	5190	SPA_SPA	0	0	256	44993	9585	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:43.626843	0.000152	udp	147.32.84.138	51003	<->	147.32.80.9	53	CON	0	0	2	214	81	flow=To-Background-UDP-CVUT-DNS-Server
2011/08/18 10:19:43.632742	0.000241	udp	147.32.84.138	47452	<->	147.32.80.9	53	CON	0	0	2	214	81	flow=To-Background-UDP-CVUT-DNS-Server
2011/08/18 10:19:43.632834	3396.510010	tcp	147.32.85.118	49177	<?>	74.125.43.109	993	PA_PA	0	0	309	24238	9823	flow=Background
2011/08/18 10:19:43.635207	0.000274	udp	147.32.84.138	53075	<->	147.32.80.9	53	CON	0	0	2	214	81	flow=To-Background-UDP-CVUT-DNS-Server
2011/08/18 10:19:43.641638	3359.782471	tcp	147.32.85.118	49175	<?>	74.125.4	161	INT	0	0	180	21477	21477	flow=Background-UDP-Attempt
2011/08/18 10:19:43.645586	0.000145	udp	147.32.84.138	55598	<->	147.32.82.87	61630	CON	0	0	121	19805	9718	flow=Background-UDP-Established
2011/08/18 10:19:43.645680	0.000167	udp	147.32.84.138	59523	<->	147.32.82.119	35520	PA_PA	0	0	215	21688	7570	flow=Background
2011/08/18 10:19:43.646857	0.000240	udp	147.32.84.138	37665	<->	147.32.84.229	13363	CON	0	0	2	137	77	flow=Background-UDP-Established
2011/08/18 10:19:27.564396	96922337314	udp	147.32.84.122	123**	<->	81727192.20	123	CON	0	0	8	720	360	flow=Background-UDP-NTP-Established-1
2011/08/18 10:19:27.347251	3557.586182	tcp	147.32.80.13	80	<?>	147.32.85.21	42920	PA_PA	0	0	144	32448	18480	flow=From-Background-CVUT-Proxy
2011/08/18 10:19:27.356309	0.000701	udp	31.141.80.206	19044	<->	147.32.84.229	13363	CON	0	0	2	137	77	flow=Background-UDP-Established
2011/08/18 10:19:27.363243	0.000564	udp	201.237.16.169	34308	<->	147.32.84.229	13363	CON	0	0	2	133	73	flow=Background-UDP-Established
2011/08/18 10:19:27.377609	3570.996094	udp	136.159.7.205	34183	<->	147.32.84.229	13363	CON	0	0	119	19244	9276	flow=Background-UDP-Established
2011/08/18 10:19:27.421768	7.981539	tcp	74.125.232.219	80	<?>	147.32.84.59	53288	FA_RA	0	0	3	180	60	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:27.426770	3547.238281	tcp	147.32.84.59	49173	<?>	147.32.91.164	61703	PA_PA	0	0	167	15953	9761	flow=Background-Established-cmpgw-CVUT
2011/08/18 10:19:27.447993	115.294983	tcp	147.32.86.208	8223	->	209.85.148.105	80	FSPA_FSPA	0	0	14	6202	1326	flow=Background-TCP-Established
2011/08/18 10:19:27.460815	2357.983398	tcp	147.32.85.120	34093	->	74.125.39.16	993	SPA_FSPA	0	0	80	9844	3445	flow=Background-TCP-Established
2011/08/18 10:19:27.548485	0.000000	udp	147.32.84.59	43087	->	124.106.92.187	27221	INT	0	0	1	109	109	flow=Background-Attempt-cmpgw-CVUT
2011/08/18 10:19:27.557831	153.453710	tcp	147.32.84.170	55623	<?>	74.125.232.199	80	FA_FRA	0	0	12	786	396	flow=From-Normal-V51-Striptek
2011/08/18 10:19:27.562960	1614.738770	udp	90.181.3.118	11034	<->	147.32.84.229	13363	CON	0	0	6	739	506	flow=Background-UDP-Established
2011/08/18 10:19:27.612198	3036.590576	udp	120.145.26.140	27663	<->	147.32.86.165	12114	CON	0	0	8	986	738	flow=Background-UDP-Established
2011/08/18 10:19:27.634551	3035.790771	udp	82.67.177.209	5838	<->	147.32.84.229	13363	CON	0	0	12	1446	1074	flow=Background-UDP-Established



Saturn: intelligent interactive data analytics

Give the users the control to do what they need to do with any data.

Through different visual techniques and unsupervised machine learning, patterns of interest are made more apparent.

Analysts remain in the problem space rather than having to think about speaking the language of the database.



Project Saturn

Security Operations

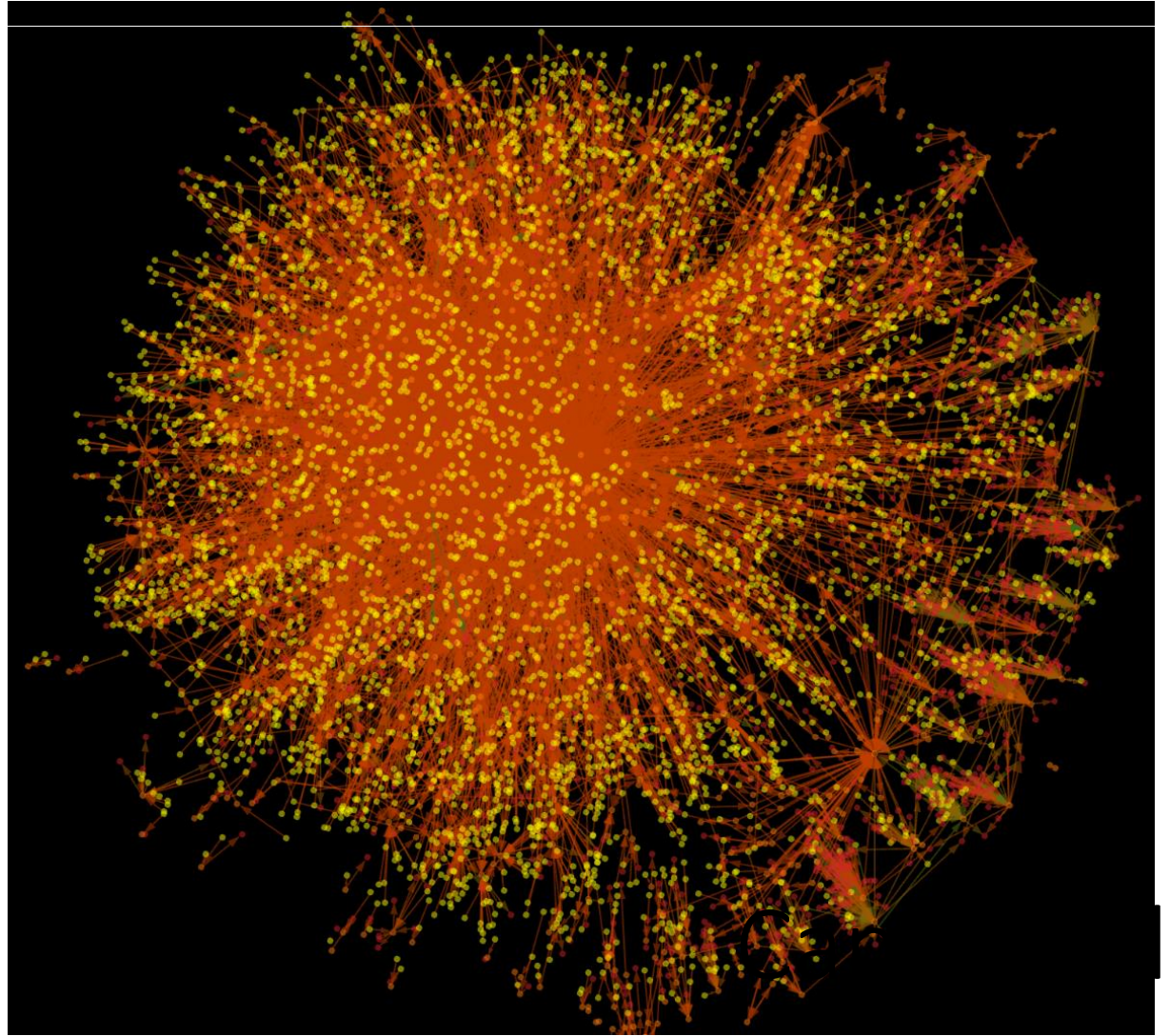


What our Security Analysts say...

“This technology has saved hours whilst analysing and creating malware reports and enabled me to create a number of views that I would have found difficult to produce elsewhere. The way the data is depicted has helped me identify malware types, users, physical locations and trends... which I may have missed.”

“I’ve got too much data at my fingertips, I need the tools to tell me where to focus my attention first”

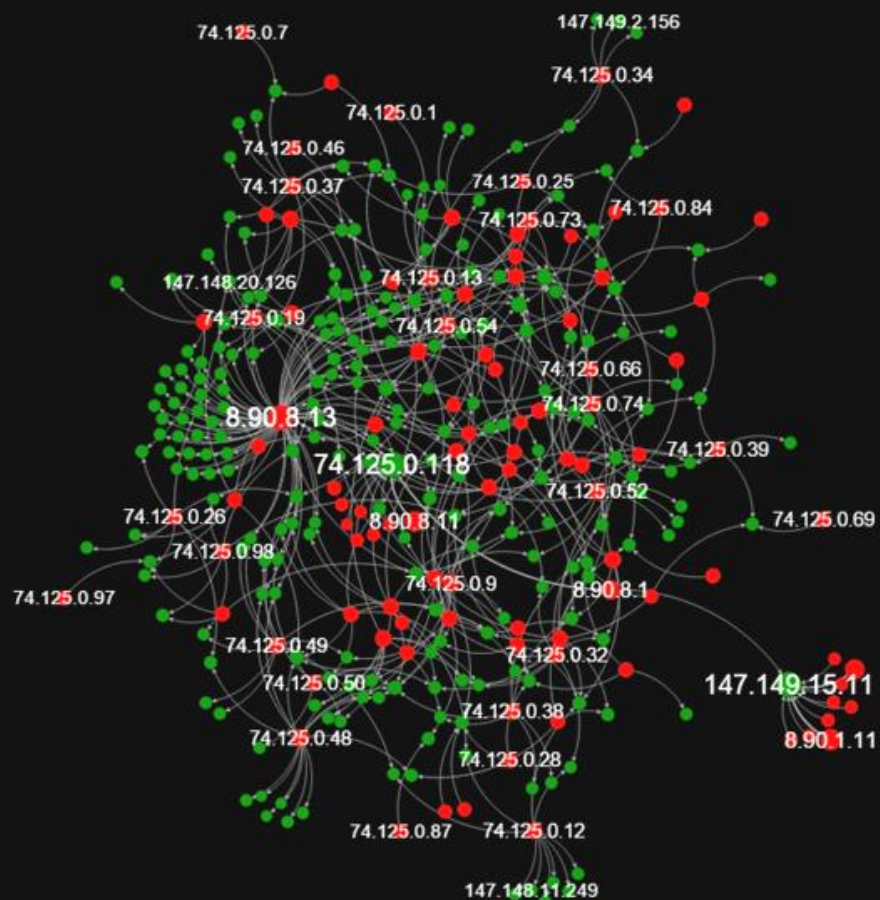
'Ridiculogram'



p?

Network : src ip, dest ip

Settings Info Link Close



Clustering : asset src org sector, dest ip, duration, geolp dst country, src ip, threat src campaign, threat src type

Settings Info Link Close

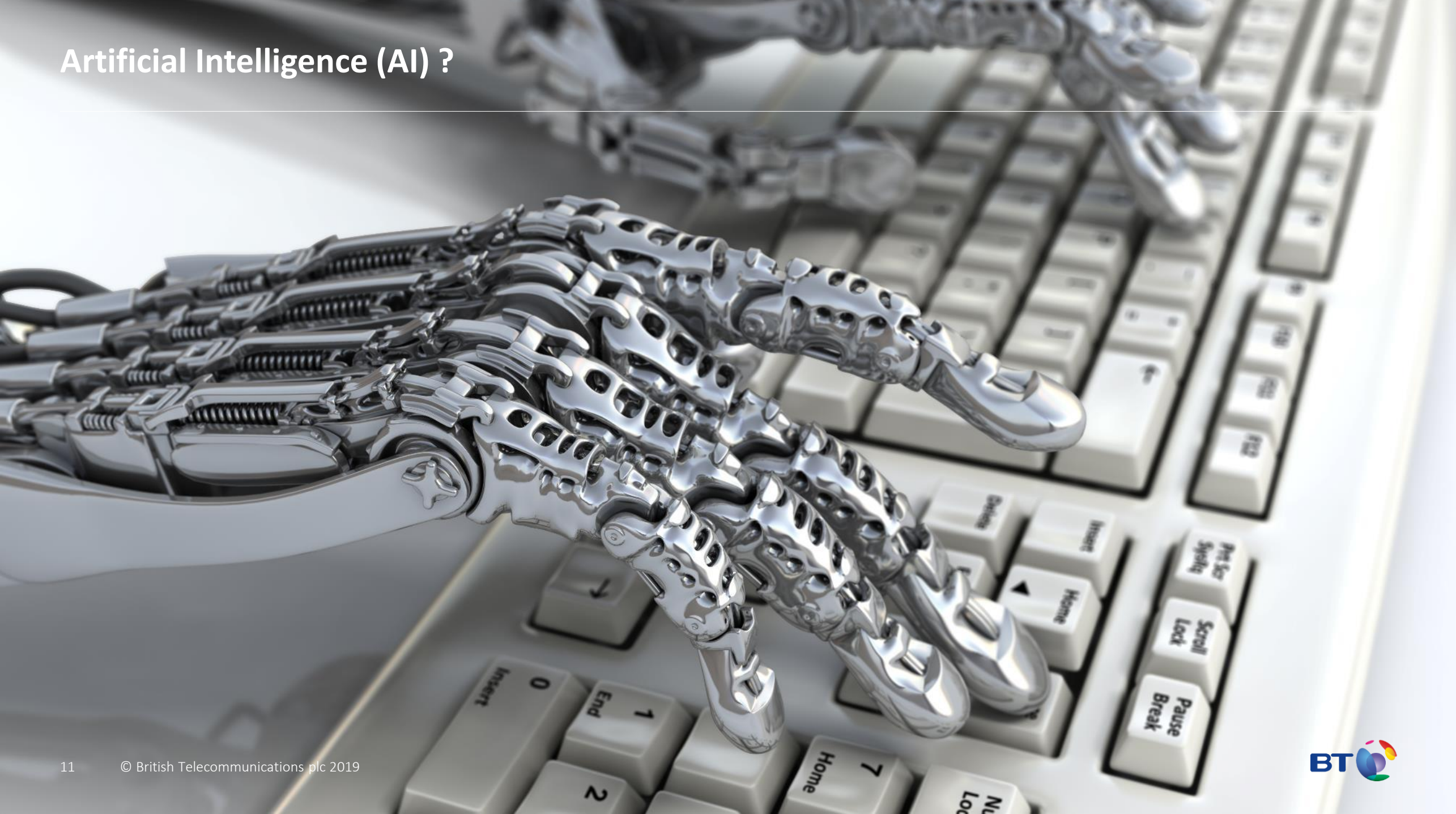


AI is necessary but...



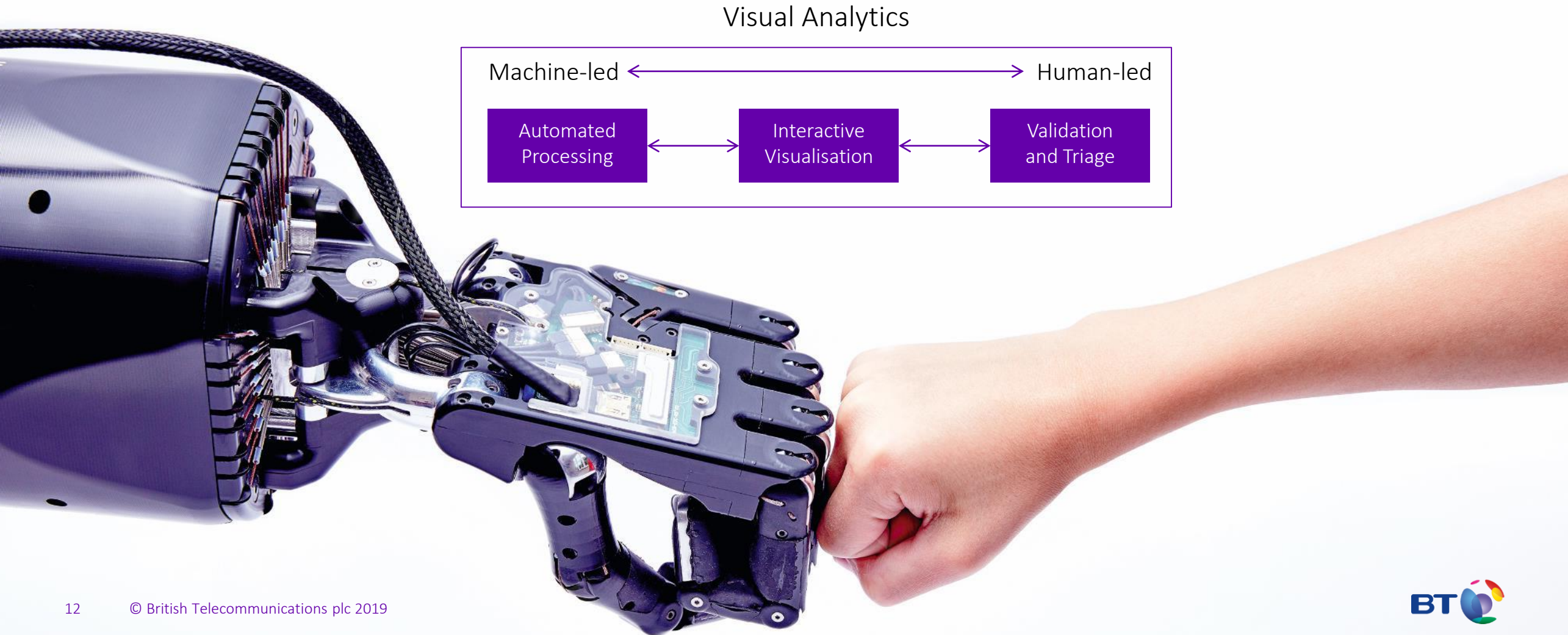
... should it be left unsupervised?

Artificial Intelligence (AI) ?

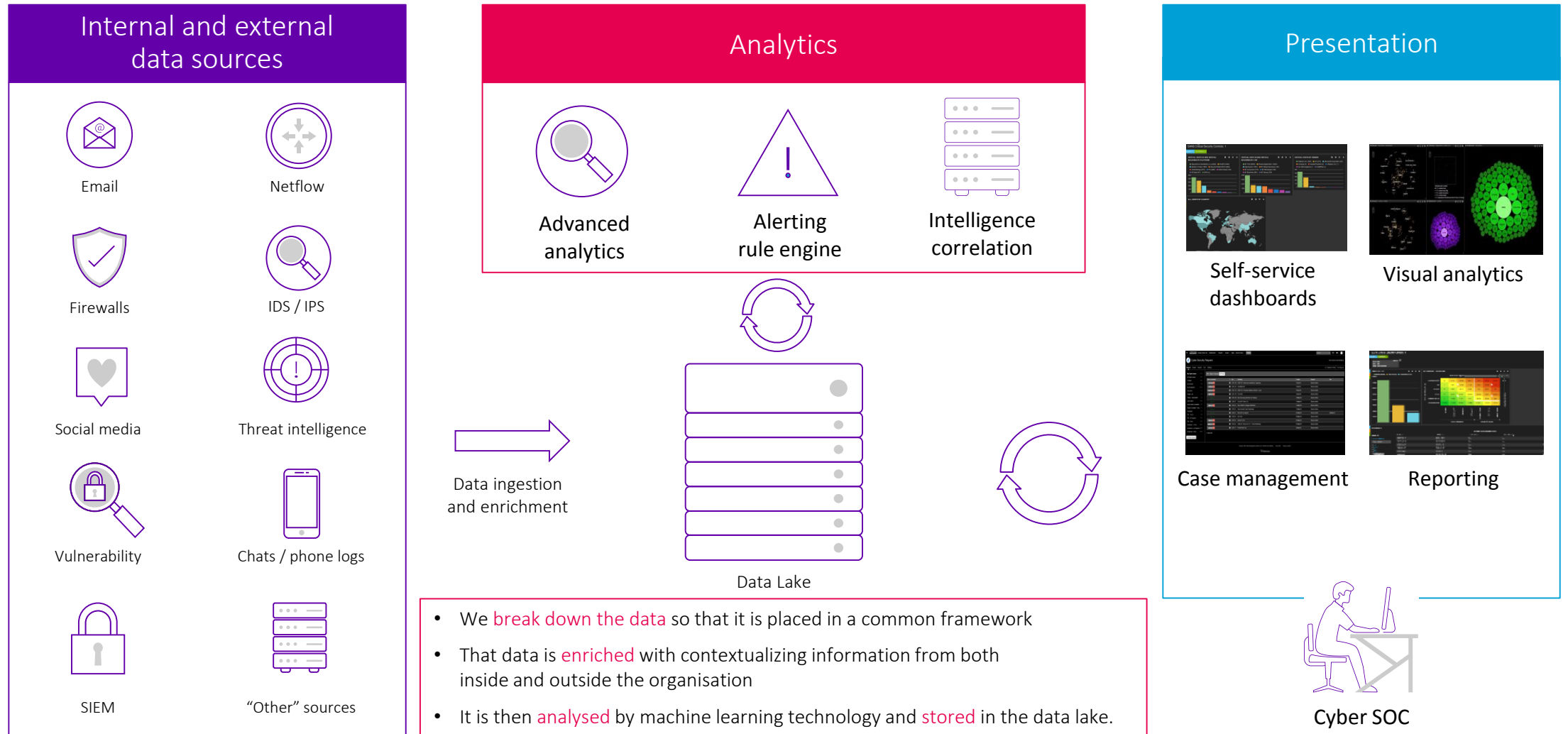


Intelligence Augmentation (IA)

Instead of fully automating the process, build and use tools that augment and integrate both human and machine strengths



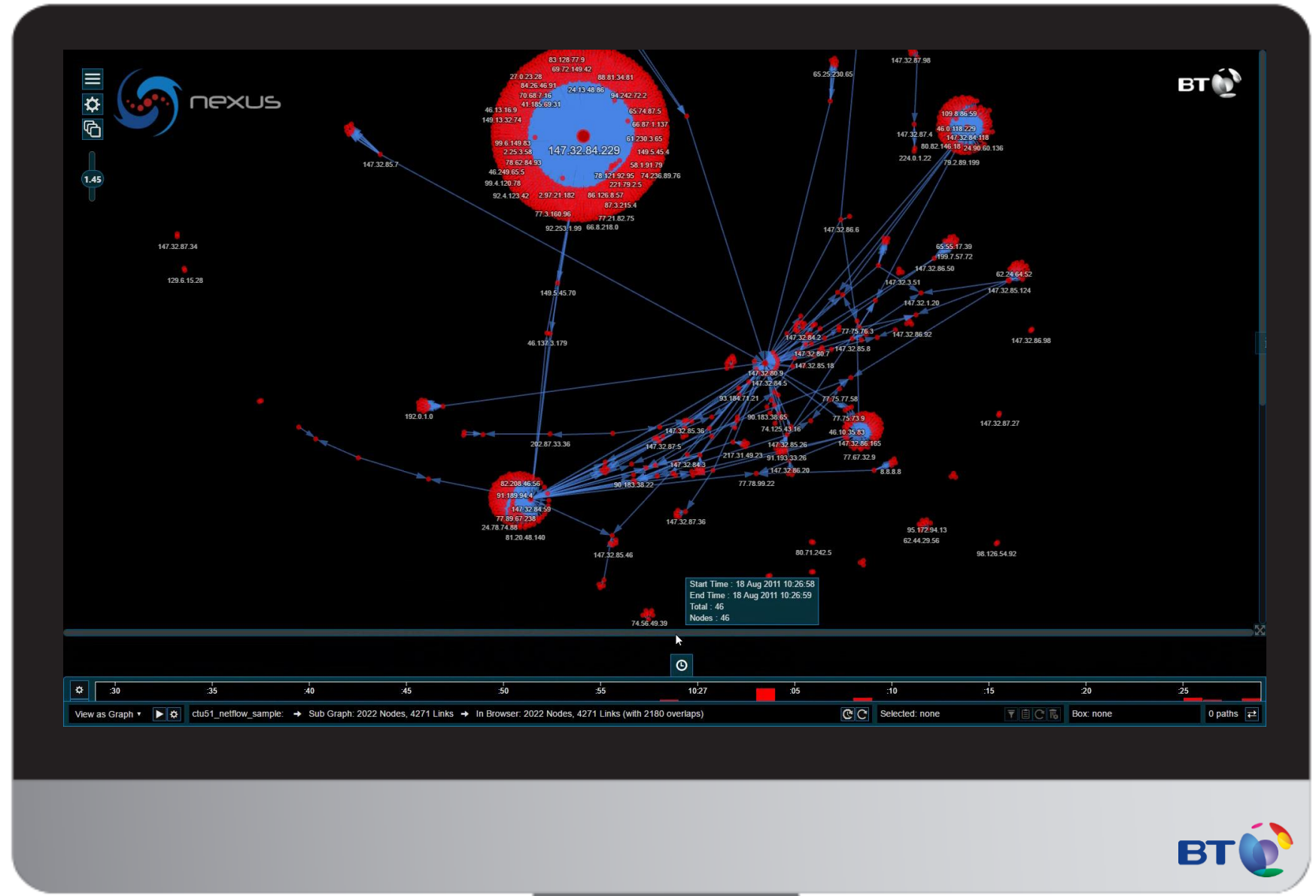
Cyber Security Platform



Nexus: next generation graph analytics

Model relationships that exist or can be derived from data and allow resultant graphs to be visually explored by analysts benefit from graph theoretic algorithms for filtering and styling the data at scale.

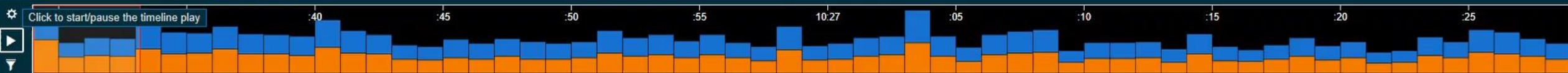
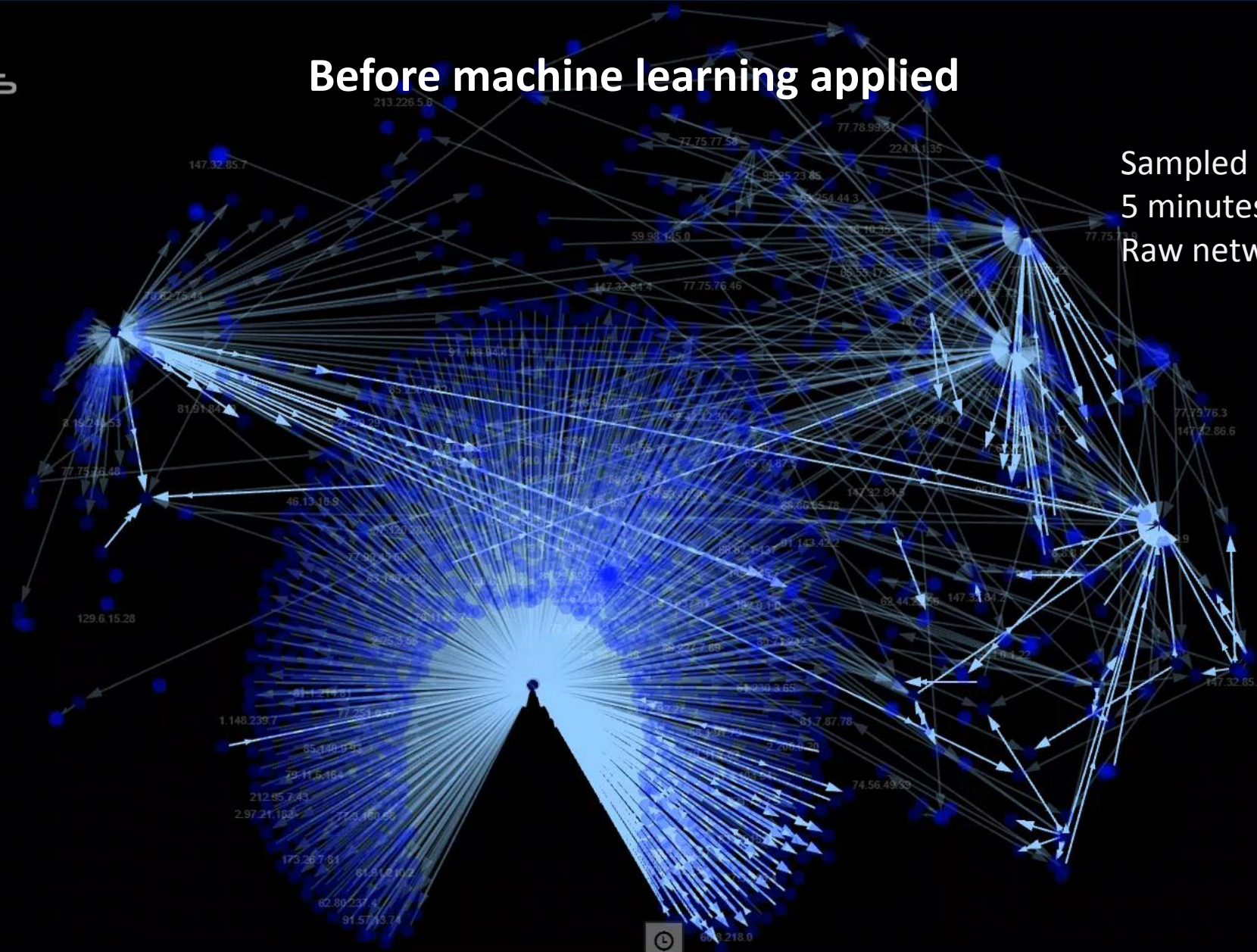
Underpinned by AI-based big data analytics techniques to preserve the most salient aspects of data before pushing to analysts.





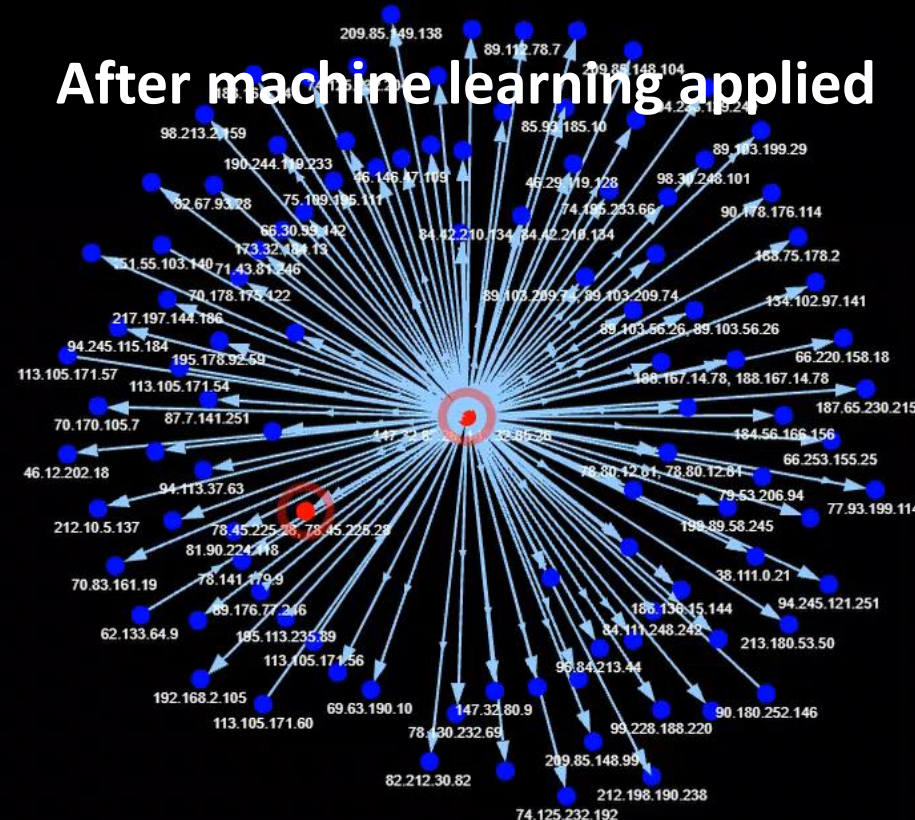
Before machine learning applied

Sampled NetFlow
5 minutes, 9,000 devices
Raw network connections





After machine learning applied

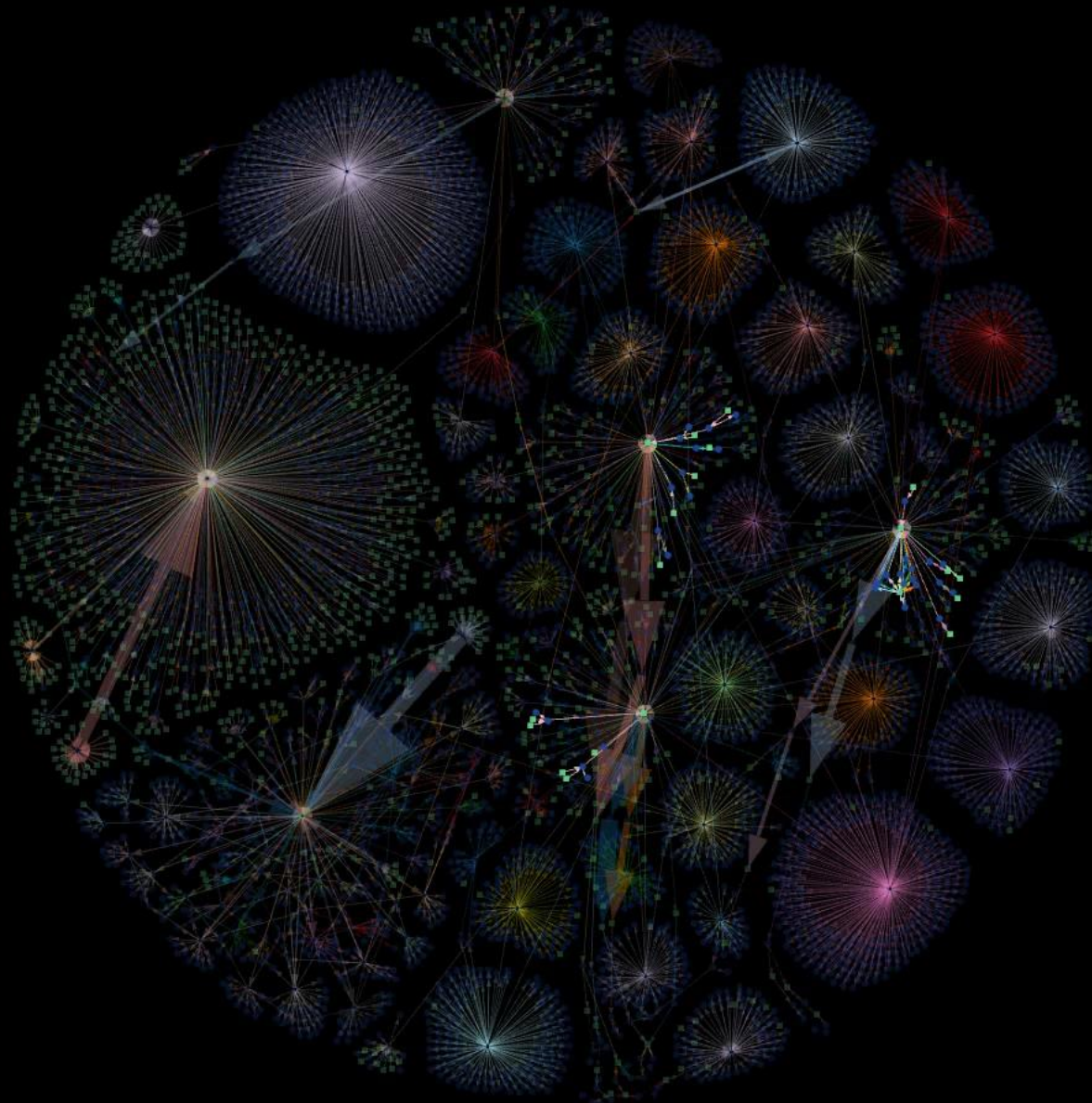


Unsampled NetFlow
5 hours, 200,000 devices
Millions of flows
Behavioural anomalies highlighted

The most suspicious activity is
selected for human triage

It takes the analyst seconds to
verify a previously unknown botnet
attack affecting just nine devices
for a matter of minutes and dismiss
a false positive





Bitcoin transactions
modelled as a graph to show
ransomware payments for
WannaCry and NotPetya



June

July

August

September

October

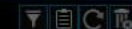
View as Graph ▾



ransomware_wider: → Sub Graph: 5147 Nodes, 85824 Links → In Browser: 5147 Nodes, 85824 Links (with 80465 overlaps)



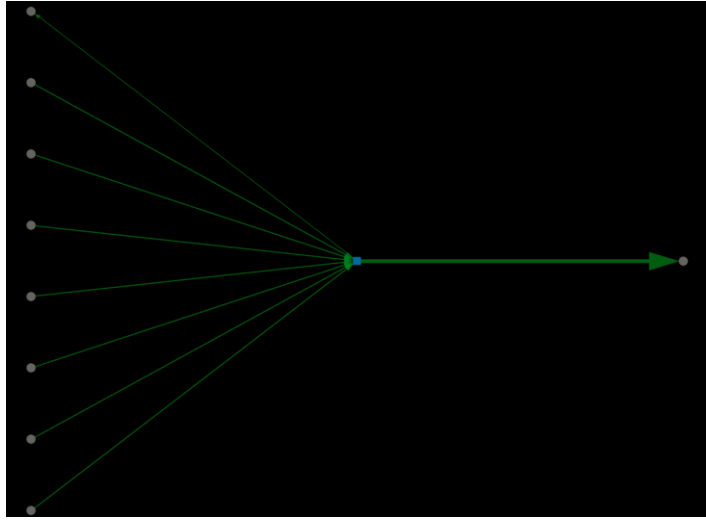
Selected: none



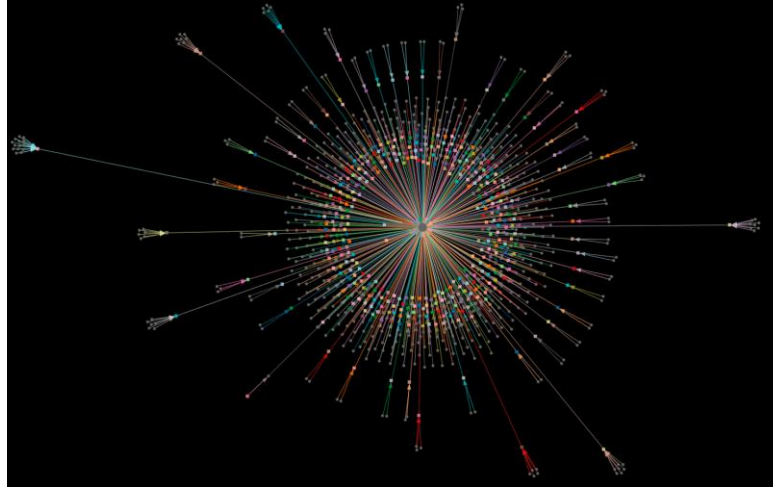
Box: none

0 paths

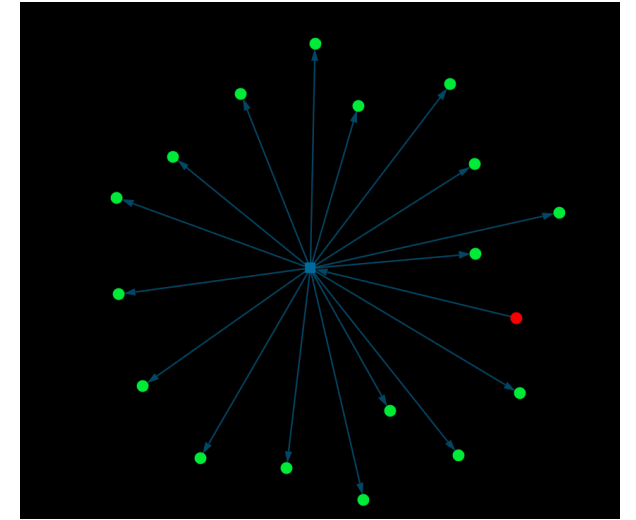




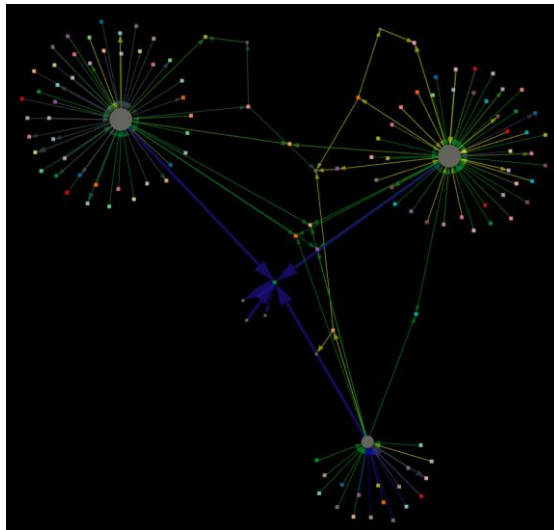
Consolidation



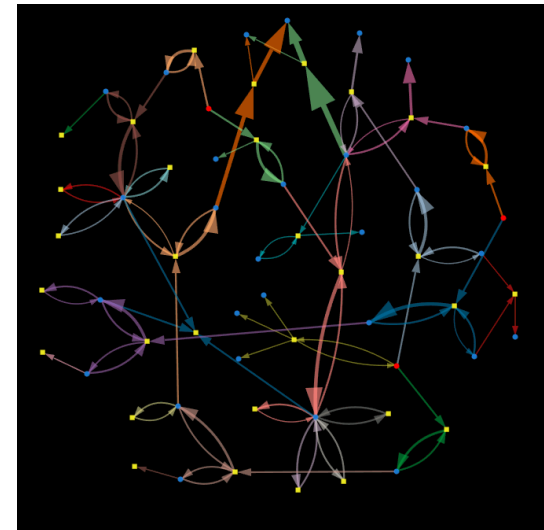
Donation



Distribution



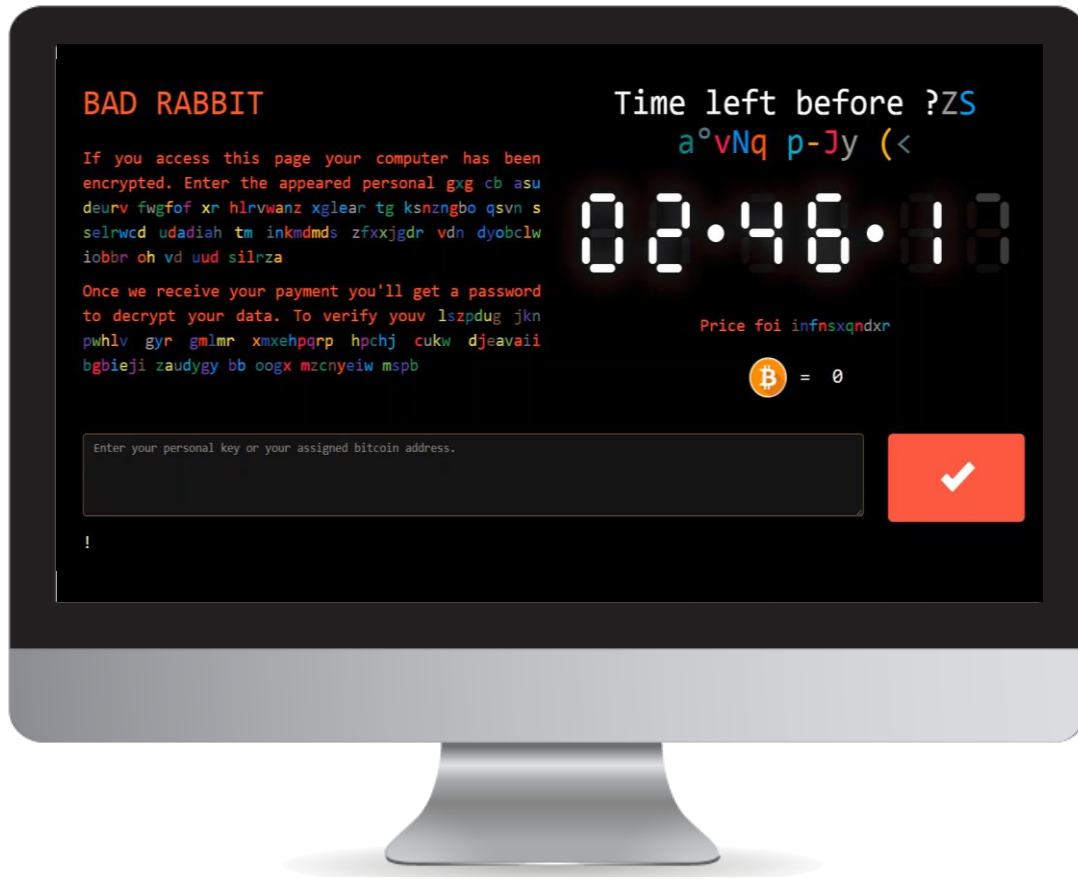
Linked Ownership



Obfuscation

Cryptocurrency Analysis

Bad Rabbit ransomware



Malicious tools, stolen data and pirate software on darknet markets



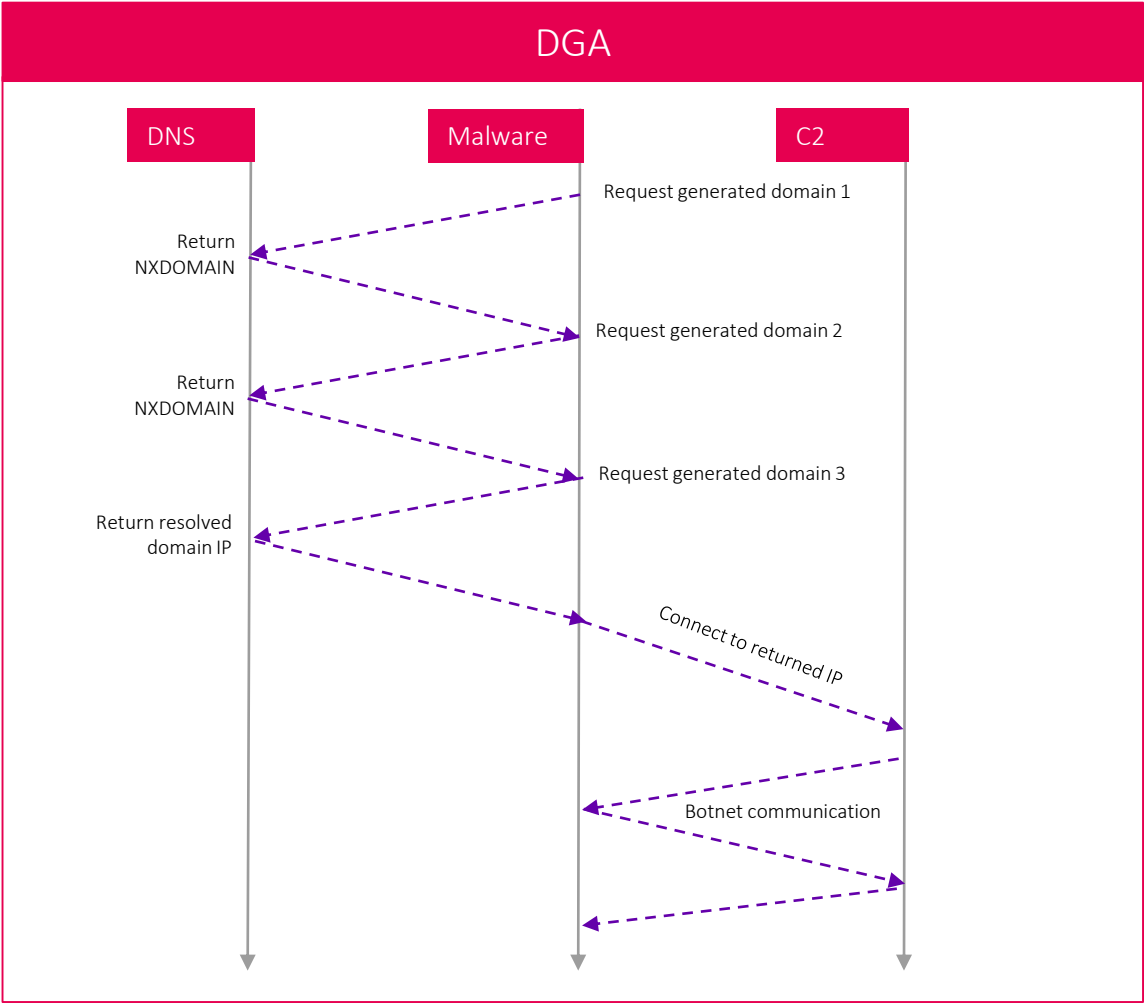
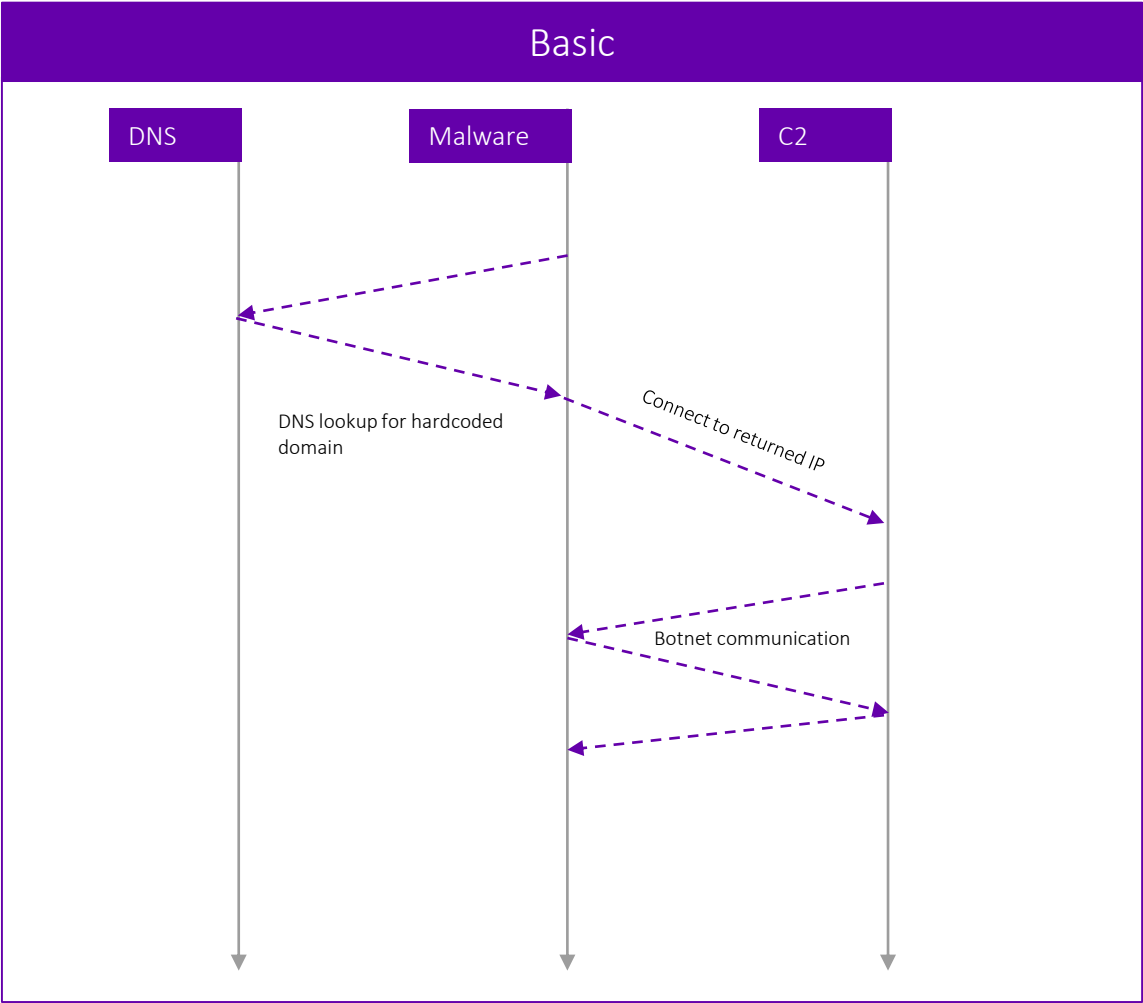
Identification of hacking software

Frequency, value, connectivity and reuse help us cluster the data so analysts can focus their effort



Domain Generation Algorithms (DGA)

Monitoring DNS lookups to detect malware beaconing

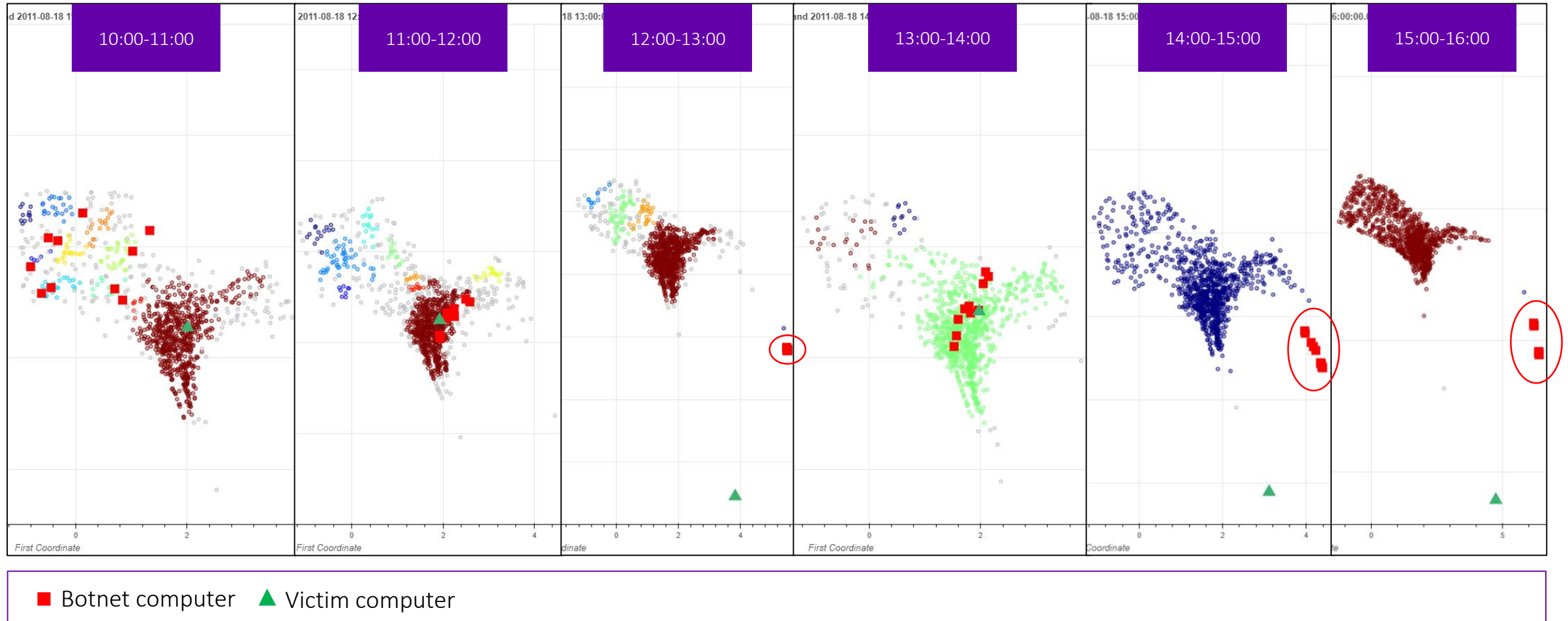


DGA Domains

Benign	Conficker	Matsnu	Ramdo	Zeus
google	uhbqolxf	scoreadmireluckapplyfitcouple	cikiugcaqcegsimg	1vz89zm5b2e981bgfhqdzake3m
facebook	gzhwfdwnjrg	plentyclubplatewatermiss	gqsasakyqmywuigy	1jjcgb11mmtru8r7xsa1xqk8zh
youtube	oxyiufvc	benefitnarrowtowersliphabit	kuiacymwmsowiasw	hxl1z91goi06z14uh54c1o1gj0v
baidu	ufaqzt	accountmoveeseemsmartconcert	skimmesmkyccouea	u2tdjf1gart7d1hp83wcvr3uaw
yahoo	cejzf	drawermodelattemptreview	cieyaaccueeseescm	1vm442615psvw16ivh963emjo8

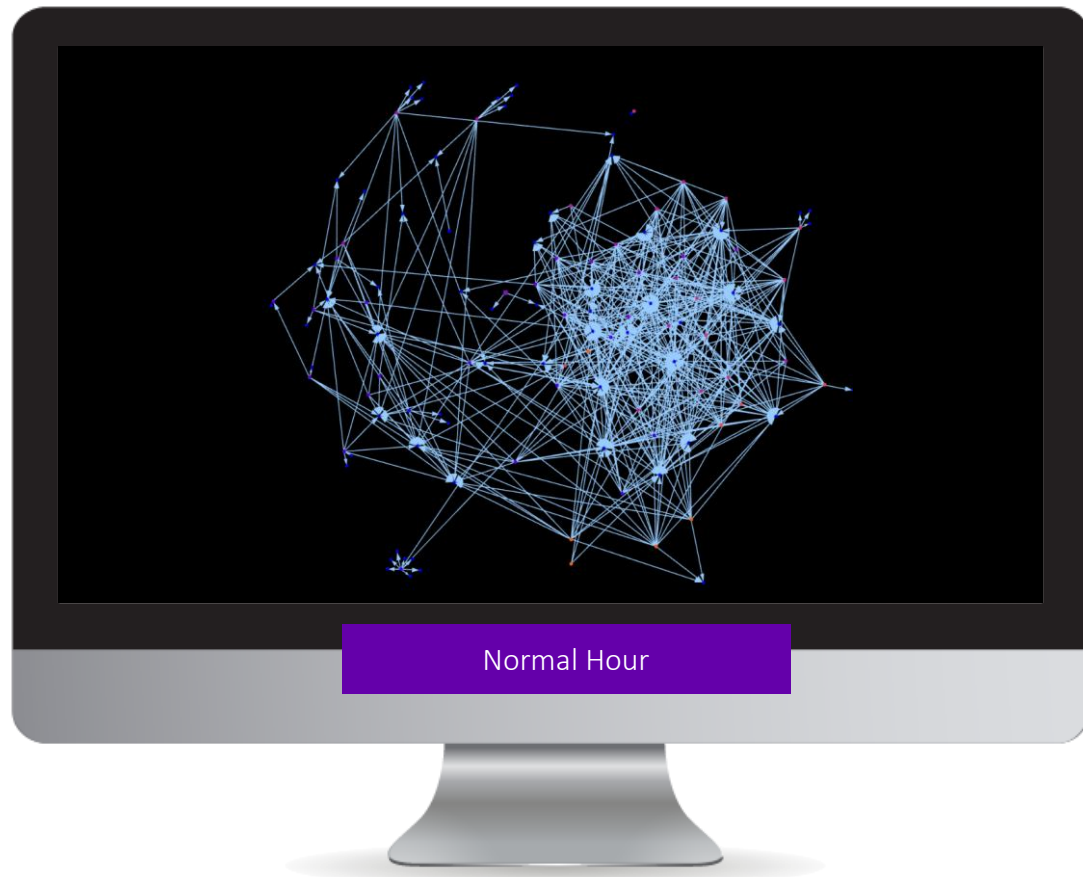
Deep Learning to Detect Network Anomalies

Hosts positioned according to their behaviour, e.g. connecting hosts, destination ports, flow size, ...



Contextualising Anomalies using Nexus

Suspicious vs Malicious

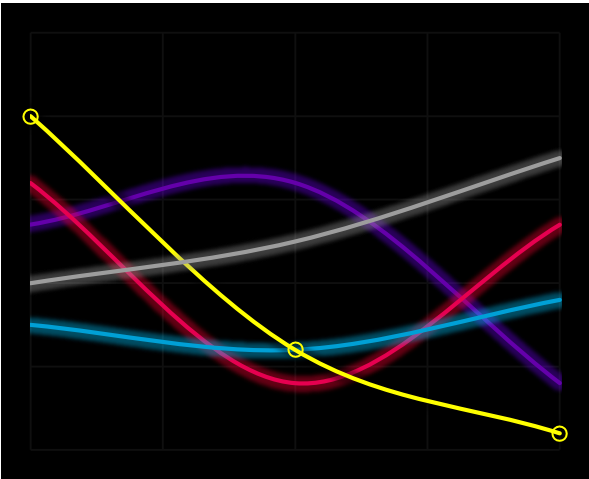


Machine Assisted Cyber Threat Hunting

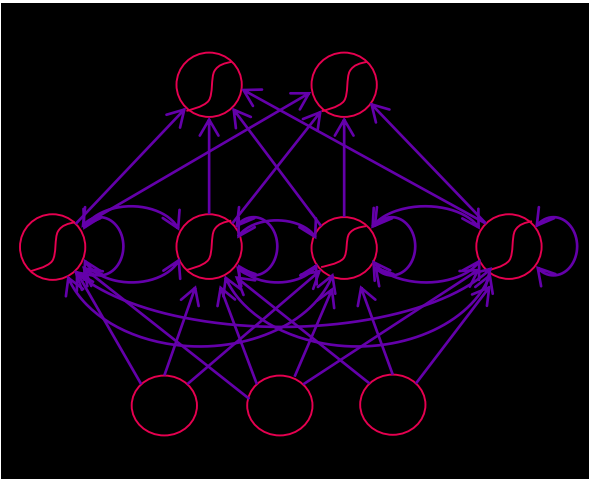
Data layer

2011/08/18 18:33:21.75961	0.000588	udp	167.32.84.229	13363	CON
2011/08/18 18:33:21.821850	0.000253	udp	87.97.59.113	6881	INT
2011/08/18 18:33:21.821909	0.000066	icmp	147.32.84.118	803283	0x11a
2011/08/18 18:33:21.878787	114.679248	tcp	147.32.85.30	58369	195.113.232.82 80 PSPA
2011/08/18 18:33:21.952945	0.000940	udp	41.218.252.75	13363	147.32.84.229 13363 CON
2011/08/18 18:33:22.058227	0.512.280804	udp	147.32.84.229	13363	95.188.133.174 51720 CON
2011/08/18 18:33:22.088044	0.000667	udp	91.122.175.91	8649	147.32.84.229 13363 CON
2011/08/18 18:33:22.203924	0.000000	udp	78.184.195.192	40263	147.32.84.229 13363 CON
2011/08/18 18:33:22.219808	0.004124	udp	213.222.191.181	99577	147.32.84.229 13363 CON
2011/08/18 18:33:22.218883	0.000464	udp	147.32.86.20	52769	147.32.88.9 55 CON
2011/08/18 18:33:22.229555	0.206327	tcp	147.32.86.20	4136	188.138.84.229 80 PSPA
2011/08/18 18:33:22.236229	1.286484	tcp	99.99.239.16	1516	147.32.84.118 6881 S RA
2011/08/18 18:33:22.247562	0.218236	udp	147.32.84.229	13363	88.238.215.189 59387 CON
2011/08/18 18:33:22.277833	0.000416	udp	147.32.85.76	58454	147.32.86.9 55 CON
2011/08/18 18:33:22.316572	1.178868	tcp	80.105.151.16	51223	147.32.84.118 6881 S RA
2011/08/18 18:33:22.425106	0.000885	udp	49.201.117.152	58125	147.32.84.229 13363 CON
2011/08/18 18:33:22.439736	0.002064	udp	147.32.85.76	62378	147.32.86.9 55 CON
2011/08/18 18:33:22.442573	0.042061	udp	147.32.85.76	52844	147.32.88.9 55 CON
2011/08/18 18:33:22.446514	0.062295	udp	147.32.85.76	50882	147.32.88.9 55 CON
2011/08/18 18:33:22.542187	0.000340	udp	147.32.84.39	57573	147.32.88.9 55 CON
2011/08/18 18:33:22.583362	0.000234	udp	147.32.84.39	62590	147.32.88.9 55 CON
2011/08/18 18:33:22.542527	0.223.000443	udp	95.133.129.59	64143	147.32.84.229 13363 CON
2011/08/18 18:33:22.563972	71.532581	tcp	147.32.85.76	1767	92.123.84.154 80 PSPA
2011/08/18 18:33:22.583418	4.433085	udp	88.212.37.9	9662	147.32.87.7 427 CON
2011/08/18 18:33:22.598189	0.0012779	tcp	147.32.86.78	1776	195.113.232.82 80 PSPA
2011/08/18 18:33:22.599880	119.181808	tcp	147.32.85.76	1771	195.113.232.74 80 PSPA
2011/08/18 18:33:22.637985	0.582184	udp	83.163.181.154	49187	147.32.84.229 13363 CON
2011/08/18 18:33:22.648446	0.000597	udp	201.52.64.136	45721	147.32.84.229 13363 CON
2011/08/18 18:33:22.786683	2634.993164	udp	95.79.186.82	44126	147.32.84.229 13363 CON
2011/08/18 18:33:22.757925	0.000639	udp	24.140.87.79	5192	147.32.84.229 13363 CON
2011/08/18 18:33:22.774717	0.000532	icmp	213.138.76.54	808080	147.32.84.225 808082 ECU
2011/08/18 18:33:22.781172	1799.458886	udp	60.46.72.55	55487	147.32.84.229 13363 CON
2011/08/18 18:33:22.789734	0.713809	udp	68.41.206.159	64861	147.32.84.229 13363 CON
2011/08/18 18:33:22.799683	3180.135895	udp	89.78.69.38	39489	147.32.84.229 13363 CON
2011/08/18 18:33:22.834157	0.000123	udp	147.32.84.138	56748	147.32.88.9 55 CON
2011/08/18 18:33:22.843172	0.000122	udp	147.32.84.138	96666	147.32.88.9 55 CON
2011/08/18 18:33:22.854453	0.047104	tcp	213.138.76.54	3920	147.32.84.225 4899 S
2011/08/18 18:33:22.843884	0.000268	udp	147.32.84.138	54667	147.32.88.9 55 CON
2011/08/18 18:33:22.863851	0.000274	udp	147.32.84.138	40888	147.32.88.9 55 CON
2011/08/18 18:33:22.864745	0.000301	udp	147.32.84.138	40113	147.32.88.9 55 CON
2011/08/18 18:33:22.848752	0.000380	udp	147.32.84.138	32061	147.32.88.9 55 CON
2011/08/18 18:33:22.853222	0.640140	tcp	147.32.86.79	40932	94.188.187.185 80 PSPA
2011/08/18 18:33:22.854822	0.000313	udp	147.32.84.138	42325	147.32.88.9 55 CON
2011/08/18 18:33:22.854826	0.000329	udp	147.32.84.138	53799	147.32.88.9 55 CON
2011/08/18 18:33:22.858775	0.000218	udp	147.32.84.138	39159	147.32.88.9 55 CON
2011/08/18 18:33:22.858782	0.000259	udp	147.32.84.138	56882	147.32.88.9 55 CON
2011/08/18 18:33:22.858782	0.000115	udp	147.32.84.138	51643	147.32.88.9 55 CON

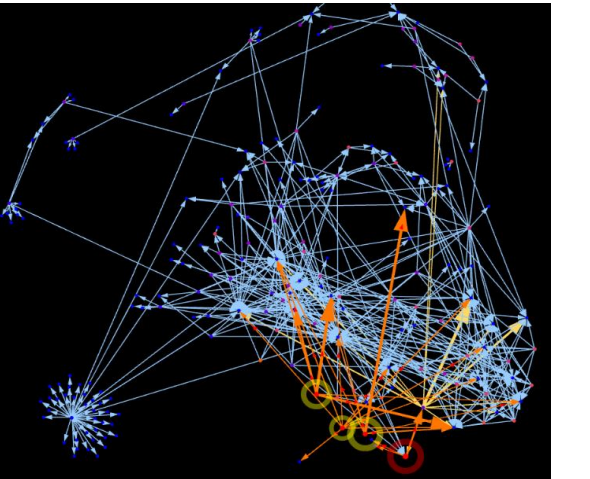
Feature layer



Model layer



Threat layer



“Computers are incredibly fast, accurate, and stupid; humans are incredibly slow, inaccurate, and brilliant; together they are powerful beyond imagination”

- attributed to Albert Einstein



