

Oxford Internet Institute
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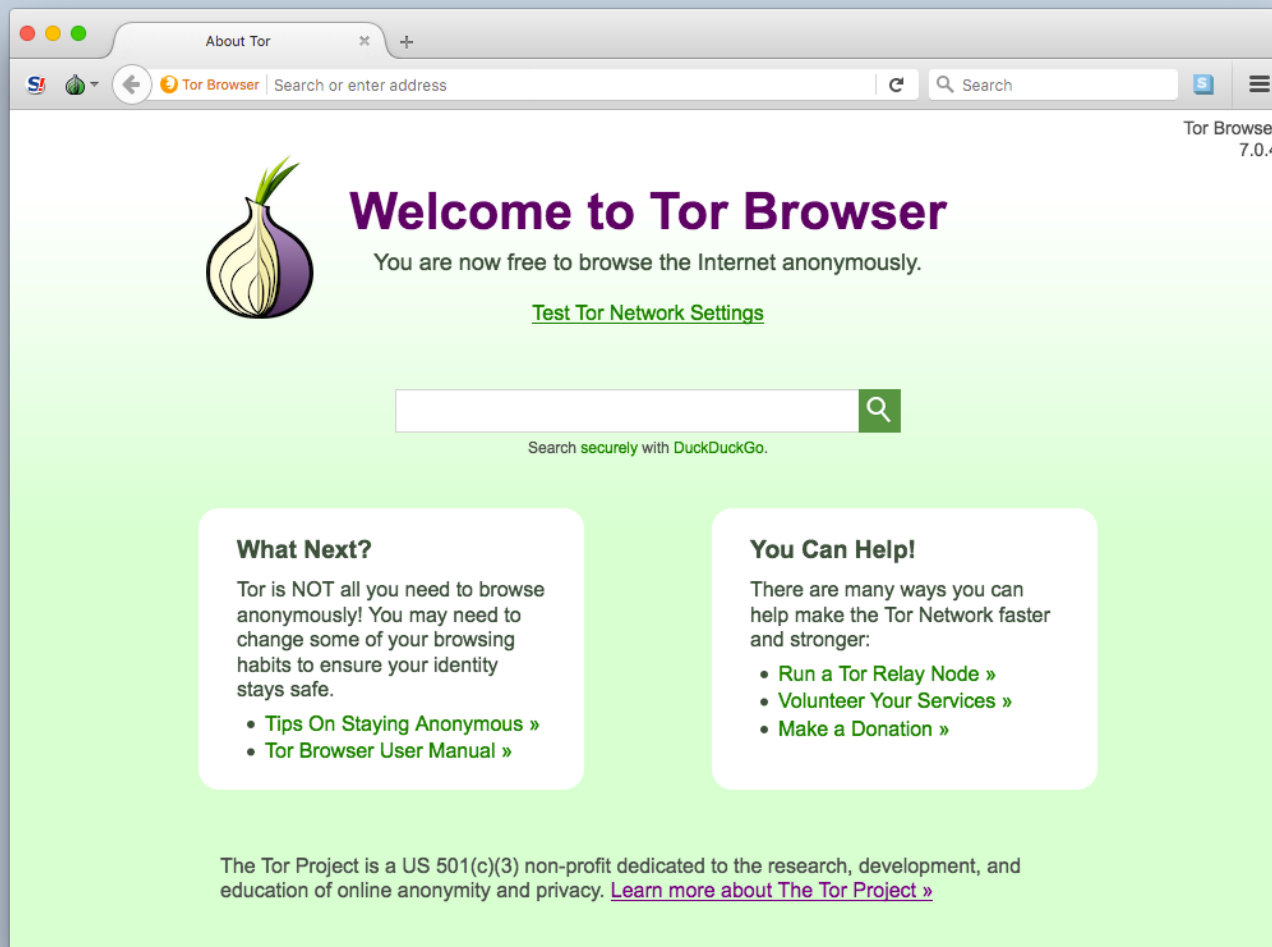
The Economic Geography of Darknet Marketplaces

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www.oii.ox.ac.uk/research/projects/economic-geog-darknet
@OiiDarknet

September 8, 2017

The “Darknet”: Anonymisation with Tor



Darknet Markets: Platforms for Illicit Trades

The screenshot shows the Silk Road anonymous marketplace interface. At the top left is the Silk Road logo featuring a camel and the text "Silk Road anonymous marketplace". To the right, it says "Welcome nowOpen!" and lists "messages(0) | orders(0) | account(฿0) | settings | log out". Below this is a search bar and a shopping cart icon with "(0)".

Shop by category:

- Drugs(752)
 - Cannabis(280)
 - Ecstasy(35)
 - Dissociatives(11)
 - Psychedelics(84)
 - Opioids(62)
 - Stimulants(53)
 - Other(107)
 - Benzos(70)
- Lab Supplies(6)
- Digital goods(98)
- Services(48)
- Money(55)
- Weaponry(15)
- Home & Garden(14)
- Food(4)
- Electronics(5)
- Books(49)
- Drug paraphernalia(28)
- XXX(30)
- Medical(3)
- Computer equipment(4)
- Apparel(4)
- Musical instruments(2)
- Tickets(1)
- Forgeries(13)

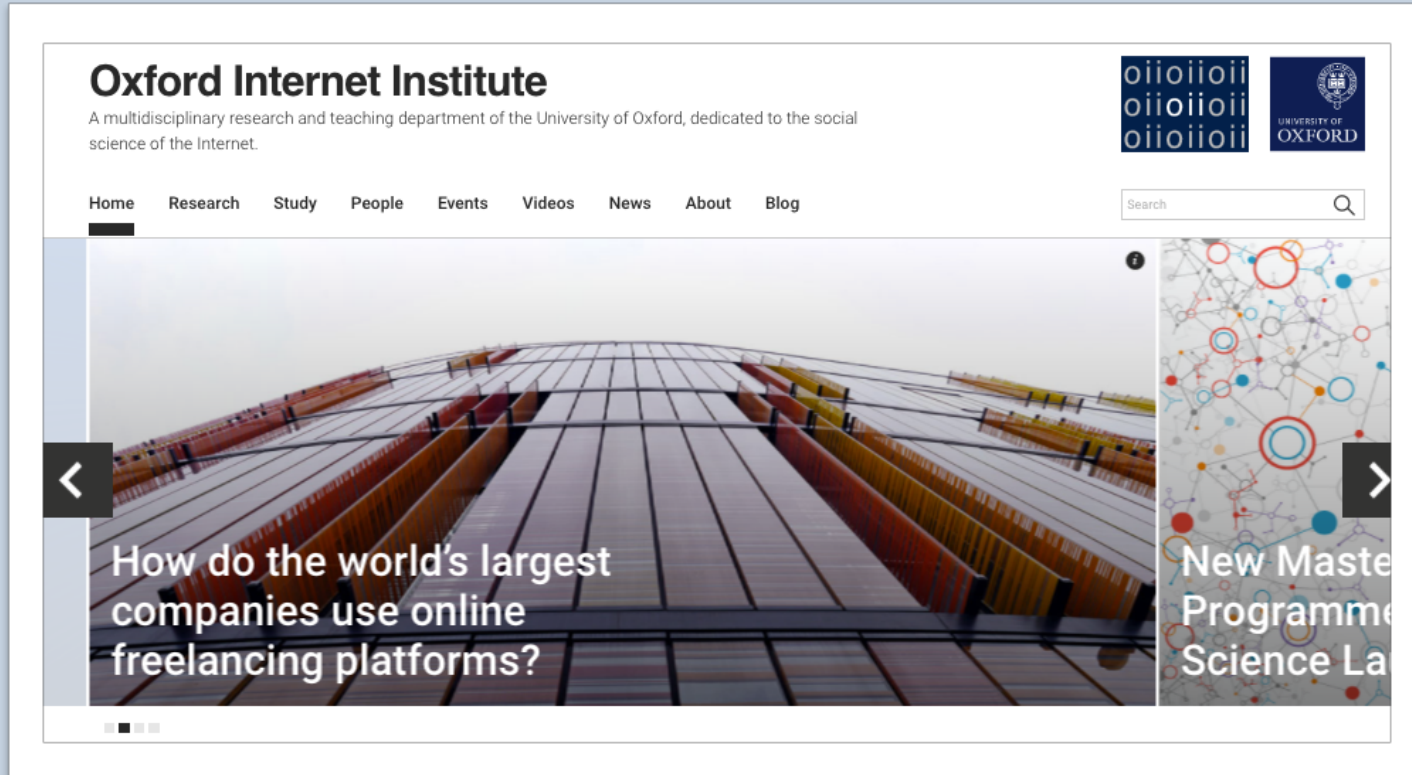
Product Listings:

Image	Product Name	Price
	5 Marijuana Butter Chocolate Chip...	฿8.53
	4mg. TIZANIDINE (zanaflex) x25	฿2.09
	US customers only Express...	฿2.79
	4 x 20MG Original Lily Cialis	฿7.85
	(1g) High-grade Crystal Meth	฿11.95
	MindFood - Protect your brain!...	฿3.69
	to US 1/4 lb (qp) BC Master Kush...	฿121.37
	How to Grow Mushrooms	฿0.14
	Mushroom Indoor Growing - Easy...	฿0.29

News:

- Escrow hedging **update**
- New feature to help protect **sellers**
- We are **hiring!** Get paid for a referral, too...
- Reclaim lost coins from **MyBitcoin.com**
- Seller ranking and feedback **overhaul**
- Change your Mt. Gox **password**

The Oxford Internet Institute (OII) at the University of Oxford



<https://www.oii.ox.ac.uk/>

What is the Economic Geography of Darknet Markets?

- Economic Geography: what drives economic activity in certain places but not others?
- For example, we might want to ask:
 - What is the number of heroin sellers in every country?
 - What is the geography of the online weapons trade?
 - How widely distributed is the trade of new psychoactive substances (NPS)?
- We are **now building a reusable data set** at the country level
- Mapping, visualising, analysing the data
- **We plan to open it up to the public!**

Our Research Approach

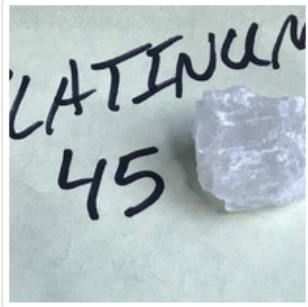
- Primarily we seek to understand the social phenomenon.
- This is **independent academic research**, we have no ties to law enforcement or platform operators. The project is funded by Google and the Alan Turing Institute, who do not influence the work.
- This is **data-centric** and **quantitative** work, rather than ethnographic. Observational studies, based on readily-available public information. Primarily we scrape catalogue and trading data at large scale, and then analyse and visualise it.
- **We are not collecting information about individuals.** Can't see individual trades, only information that is shown on market platforms such as product metadata, buyer feedback, and vendor profiles.



A Survey of the Largest Markets

#	Market	Address	Type	Live?	Constraints										Catalogue size			Language?	Comments		
					Scraper done?	Parser done?	Needs login?	Needs invite?	Sequential IDs?	Full listings?	Stable ordering?	Listing dates?	Sales counter?	Feedback dates?	(Vendor-fb counter?)	Stated	%			Actual	Sta/Act
1			Market	y	y	y	y	y	n	y	y	y	y	y	(y)	347,081	58.74%	136,152	39%		Navigation counters seem to i
2			Market	y		y		n	y	n	n	n	y	y		86,366	14.62%				Hard to scrape: no sequential
3			Market	y	y	y	y	n	y	y	n	n	y	y		51,381	8.70%	8,224	16%		No sequential IDs, but access
4			Market	y	y	y	n	y	y	y	n	n	y	y		39,083	6.61%	62,978	161%		Sequential IDs! No sales cour
5			Market	y	y	y	n	y	y	y	n	n	y	y		27,718	4.69%	34,741	125%	Finnish, English	Invite link via DNML. Feedbac
6			Market	y		y		y	y	y	n	n	(n)	n		23,946	4.05%				Sequential IDs, can get a full l
7			Market	y		n		y	?	?	n	n	y	n		6,000	1.02%			Russian	Items listed by vendor/shop, b
8			Market	y		y		n								1,719	0.29%			English/German	Won't be easy to scrape... no
9			Market	y		y										1,696	0.29%				
10			Market	y		y										1,257	0.21%				
11			Market	y		y										905	0.15%				
12			Market	y		y										905	0.15%				
13			Market	y		y										819	0.14%				
14			Market	y		y										633	0.11%				
15			Market	y		n										490	0.08%				
16			Market	y		y										411	0.07%			Italian	
17			Market	y		y										187	0.03%				
18			Market	y		y										184	0.03%				
19			Market	y		y										111	0.02%			French	
20			Market	n													0.00%				
21			Market	y		y	y										0.00%				Invitation requested
22			Market	y		y	y										0.00%				
23			Market	y													0.00%			French	(Stuck on registration)
24			?	n													0.00%			French	Down for maintenance
25			Forum	n													0.00%				

Extracting Product Metadata



You can browse products and vendors without logging in. For making purchases you'll need to **register an account**.

10 grams of Grade A+ Crystal Methamphetamine - USA DOMESTIC Glass

342.79 EUR (0.088284 BTC)

25 pcs in stock

[REDACTED] (3)

United States → Worldwide

This is top grade uncut and touched off the brick crystal methamphetamine. Smokes clean and burns clear. 100% satisfaction. Listing is for a 10 gram sack of glass shards.

Stealth shipping always ensured with a 1 time reship if you do not receive your package. We will be posting bulk sale opportunities once people order a few grams and realize the quality of this product.

USA domestic ships the day of if ordered Monday - Fri and will be delivered in 4 days max.

- Great communion. Great stealth. On time delivery. Decent product (over weight also) :). Thanks for [REDACTED] (€100+ • 3+) your gift, bub. I will be back. (28.8.)

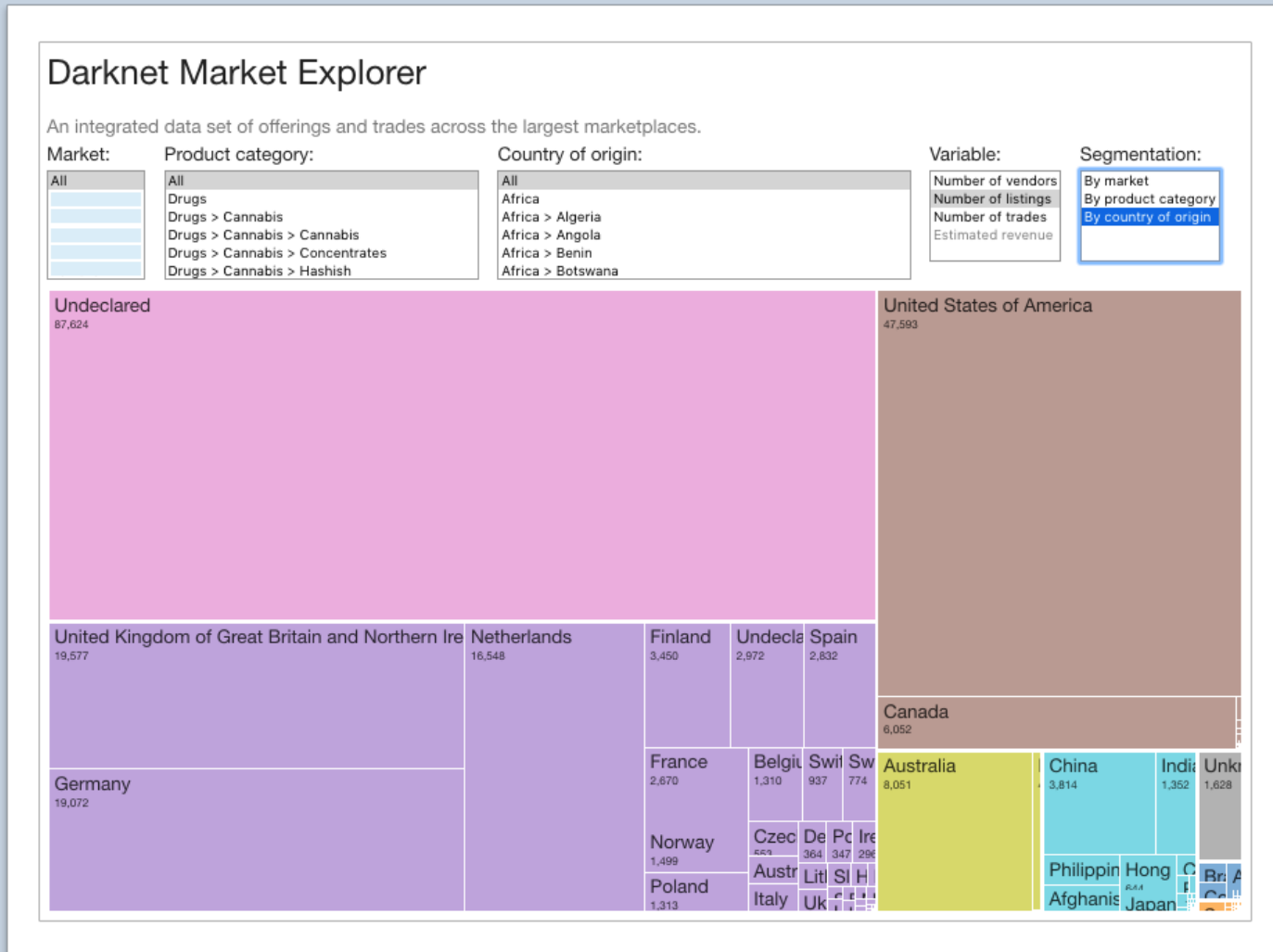
Shipping fee 5.9 EUR (Domestic Priority + Stealth/ Track!) is included in price shown above. Other shipping options can be selected at additional cost. You only pay for shipping once when you order multiple pieces of a single product or other products from same vendor

Collecting the Data Across Markets...

- In total we collected **~250k listings** across the markets we observed.
- According to our estimates, this accounts for **80-90% of the global offerings** on darknet markets at the time of data collection

Market	Title	Vendor	ISO3	CC
[REDACTED]	2 OZ Crystal Methamphetamines 56 Grams	[REDACTED]	USA	NA
[REDACTED]	3g Power Plant (★★★ Qualitat) - Free Shipping	[REDACTED]	DEU	EU
[REDACTED]	Anavar - 50mg Winstrol - 50mg Anadrol - 50mg	[REDACTED]	USA	NA
[REDACTED]	BudgetBudsExpress Shatter Pack 56g	[REDACTED]	USA	NA
[REDACTED]	Modvigil 200mg - Generic Provigil Modafinil 2...	[REDACTED]	USA	NA
[REDACTED]	AsiaMoviePass - [PORN LIFETIME ACCOUNT]	[REDACTED]	Undeclared	Undeclared
[REDACTED]	seduce-fast-food-girl XXX PC Game	[REDACTED]	Undeclared	Undeclared
[REDACTED]	100 HIGH QUALITY DOUBLE DOSED 4MG YELLOW R039 ...	[REDACTED]	CAN	NA
[REDACTED]	Rapidgator Premium Account	[REDACTED]	Undeclared	Undeclared
[REDACTED]	The Designers Guide to the Cortex M Processor ...	[REDACTED]	Undeclared	Undeclared
[REDACTED]	CANNABIS OIL AND TOP MEDICAL MARIJUANA STRAINS...	[REDACTED]	Undeclared	Undeclared
[REDACTED]	10 x Orange Rolls Royce 200MG	[REDACTED]	NLD	EU
[REDACTED]	Unknown	[REDACTED]	Unknown	Unknown
[REDACTED]	LSD - 1 Trip (200 µg)	[REDACTED]	DEU	EU
[REDACTED]	Digital Counting Scale Grain Kitchen Jewelry B...	[REDACTED]	USA	NA
[REDACTED]	XTC Pillen 210mg 500st	[REDACTED]	DEU	EU
[REDACTED]	XANAX (ALPRAZOLAM) 1 mg x 100 by PFIZER-	[REDACTED]	HUN	EU
[REDACTED]	Special OFFER - 14g - MDMA 84% Dutch Import 10...	[REDACTED]	GBR	EU
[REDACTED]	Videosz/n	[REDACTED]	Undeclared	Undeclared
[REDACTED]	GHRP2, 10mg/vial, Bio Peptide, 100% Quality	[REDACTED]	Undeclared	EU

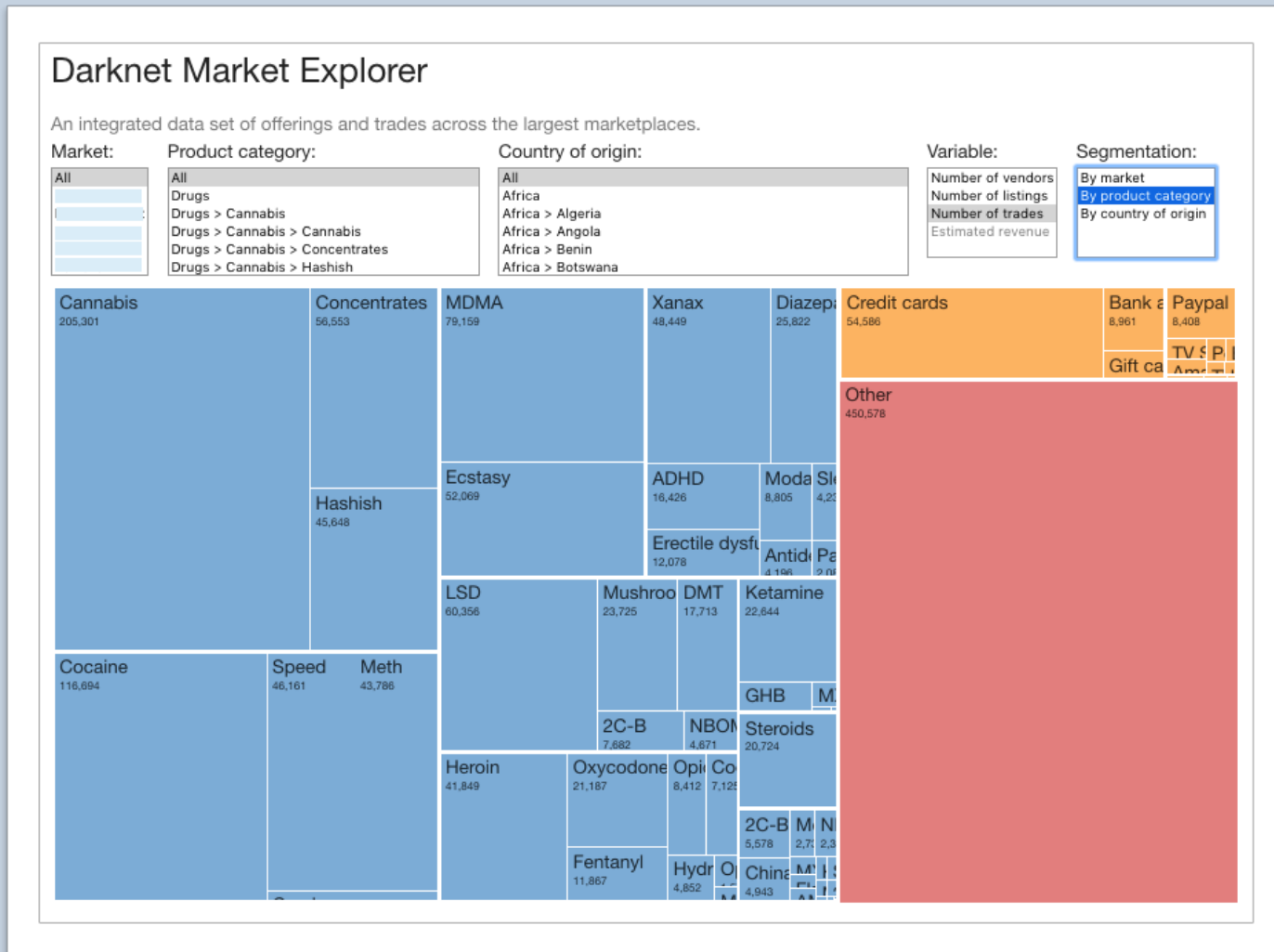
A First Market Overview, by Geography



Developing a Simple Product Taxonomy

- Drugs: **Cannabis** (Marijuana, Concentrates, Hashish), **Dissociatives** (GBL, GHB, Ketamine, MXE, MXP, PCP), MDMA, Ecstasy, **New Psychoactive Substances** (2C-B, 2C-E, 2C-I, 4-MEC, AMT, China White, DMAA, Flakka, Kratom, M1, MXE, MXP, Mephedrone, NBOMe, Spice/K2), **Opioids** (Codeine, Fentanyl, Heroin, Hydrocodone, Morphine, Opioid detoxification, Opium, Oxycodone), **Pharmaceuticals** (ADHD, Antidepressants, Diazepam, Erectile dysfunction, Modafinil, Painkillers, Sleeping pills, Xanax), **Psychedelics** (2C-B, DMT, LSD, Mushrooms, NBOMe), **Steroids**, **Stimulants** (Cocaine, Crack, Meth, Speed).
- Information goods: **Accounts** (Amazon, Ebay, Paypal, Porn, TV & Cable, TV Streaming, Uber), **Malware** (Botnets, Malware, Ransomware), **Money** (Bank drops, Credit cards, Gift cards).
- Physical goods: Weapons (Ammunition, Explosives, Hand weapons, Long-range weapons).

Developing a Simple Product Taxonomy



Buyer Reviews as Indicators of Activity



You can browse products and vendors without logging in. For making purchases you'll need to **register an account**.

❄️❄️❄️ Dutch Import MDMA 90% ❄️❄️❄️ 1g FREE UK NDD

12.63 EUR (0.003254 BTC)

more than 25 pcs in stock

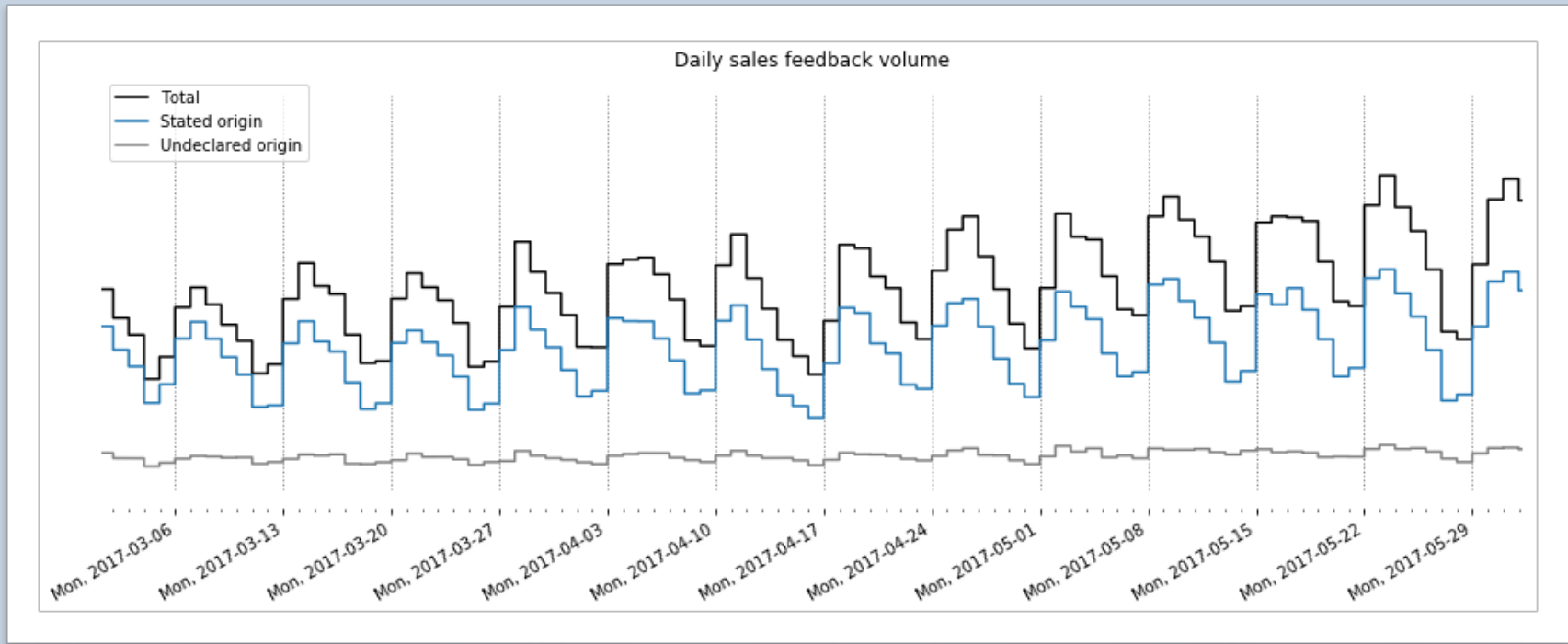
██████████ (2326 / -24)

United Kingdom → France, Germany, United Kingdom, Ireland, Italy, Spain, Portugal

❄️❄️❄️ Dutch Import MDMA 90% ❄️❄️❄️

- Really good. Very Strong (yesterday) ██████████ (€500+ • 25+)
- fab as usual :) wont be using any one else, great value, awesome product, couldn't be packaged better, NDD (25.8.) ██████████ (€100+ • 10+)
- Can't fault ██████████ great product, the best packaging, NDD always, wouldnt use anyone else for product thanks ██████████ (25.8.) ██████████ (€100+ • 10+)
- Love it, great vendor & love the packaging NDD again :) (23.8.) ██████████ (€100+ • 10+)
- fab, NDD : (23.8.) ██████████ (€100+ • 10+)

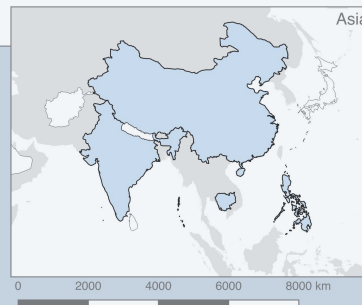
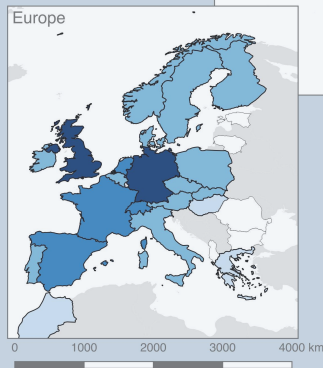
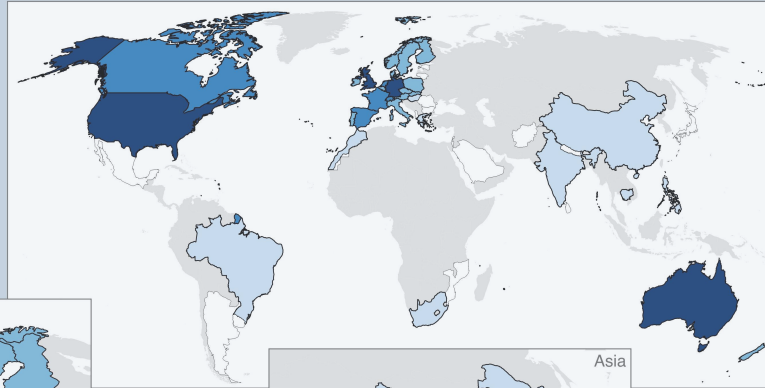
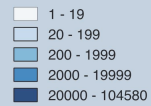
Estimating Trading Activity over Time



Where are Which Goods Traded?

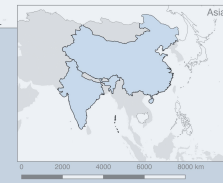
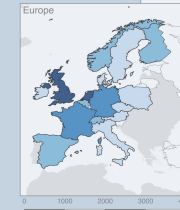
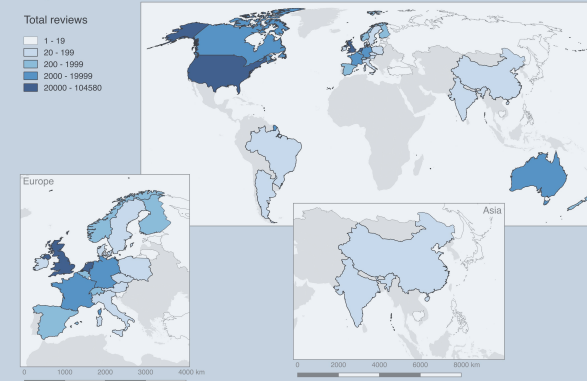
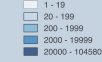
Drugs > Cannabis

Total reviews



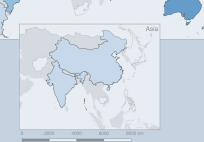
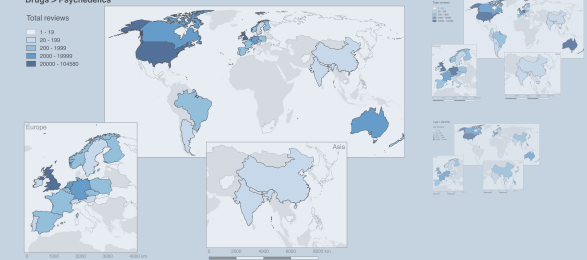
Drugs > MDMA

Total reviews



Drugs > Psychedelics

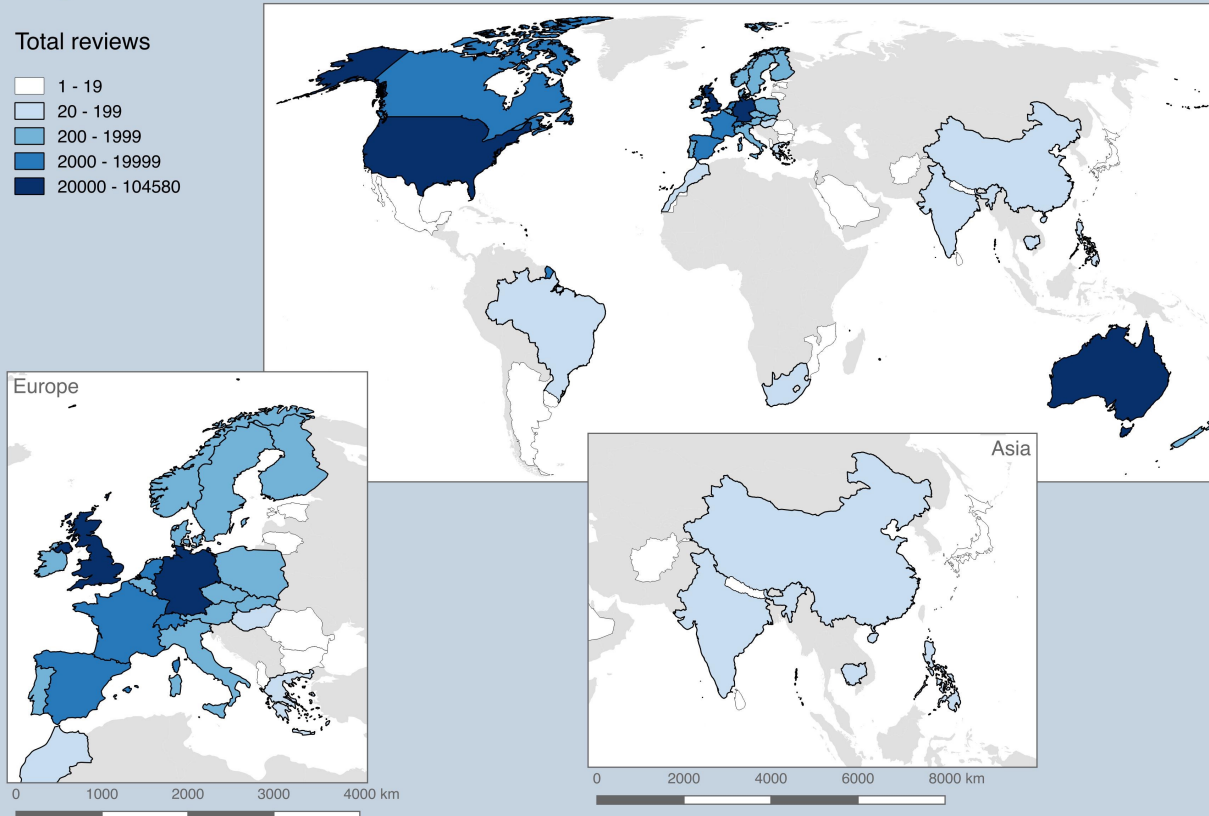
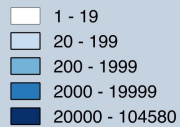
Total reviews



A Focus on Recreational Drugs for the English-speaking West (1/3)

Drugs > Cannabis

Total reviews



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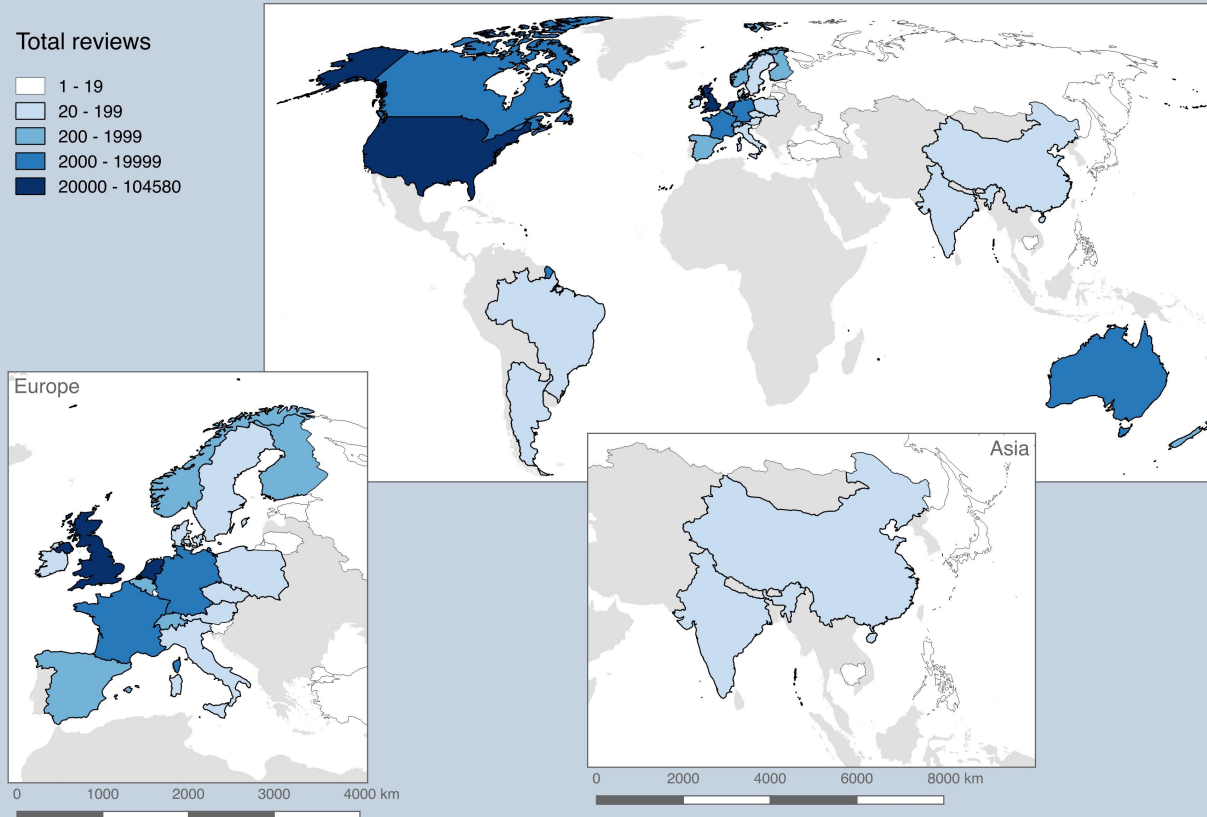
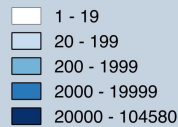
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A Focus on Recreational Drugs for the English-speaking West (2/3)

Drugs > MDMA

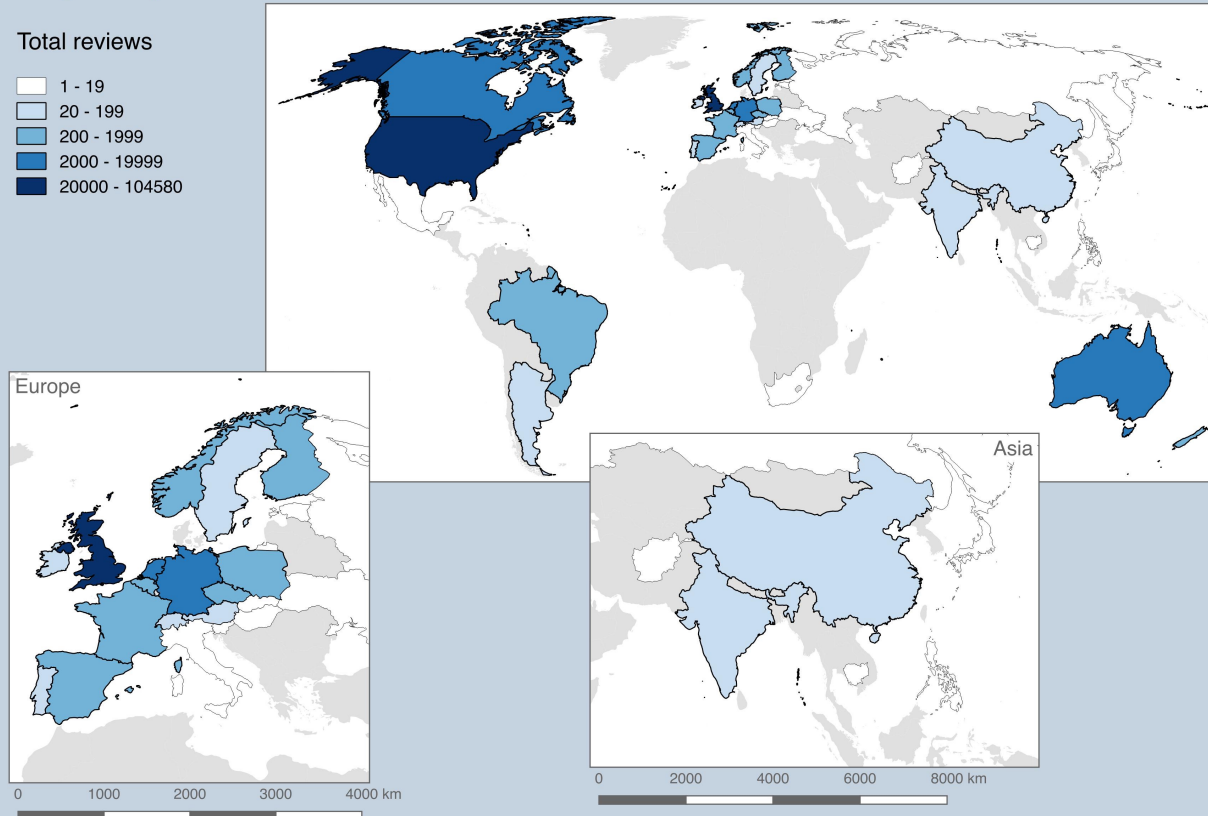
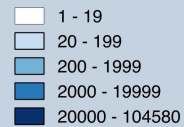
Total reviews



A Focus on Recreational Drugs for the English-speaking West (3/3)

Drugs > Psychedelics

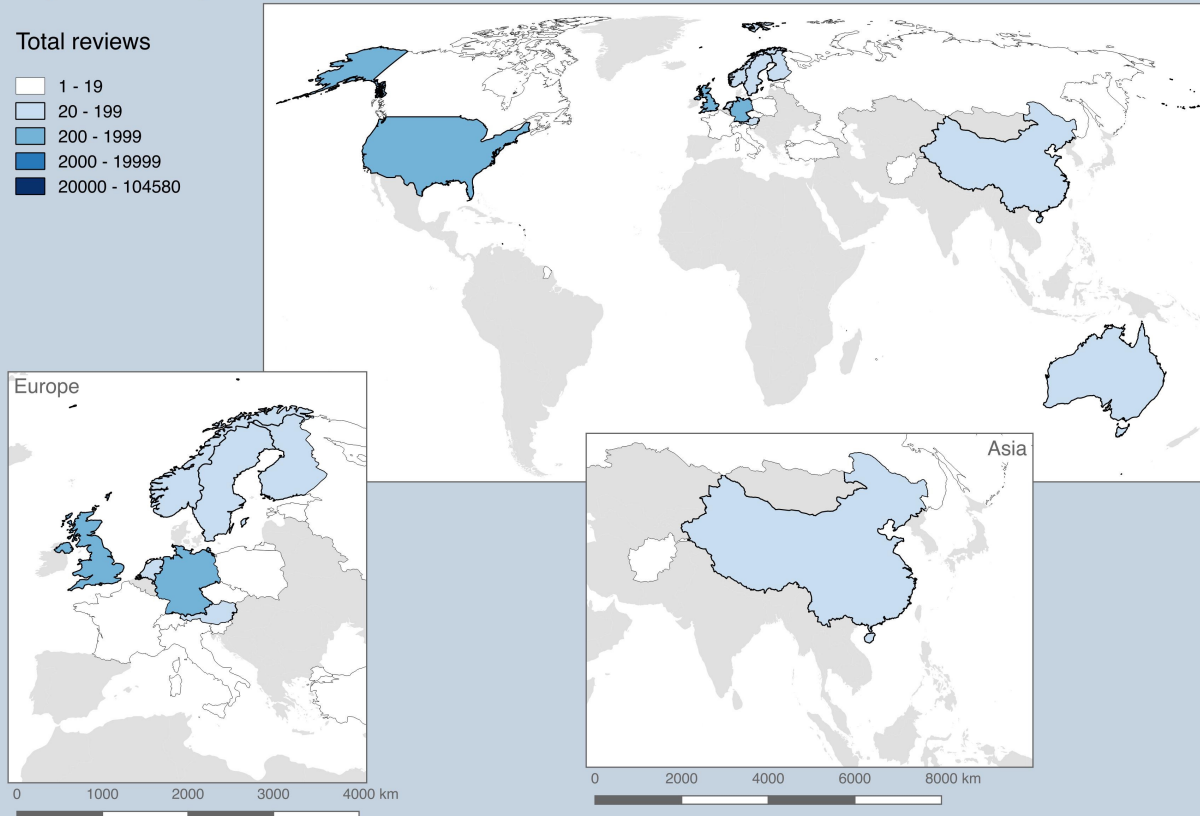
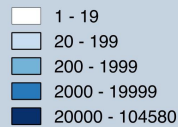
Total reviews



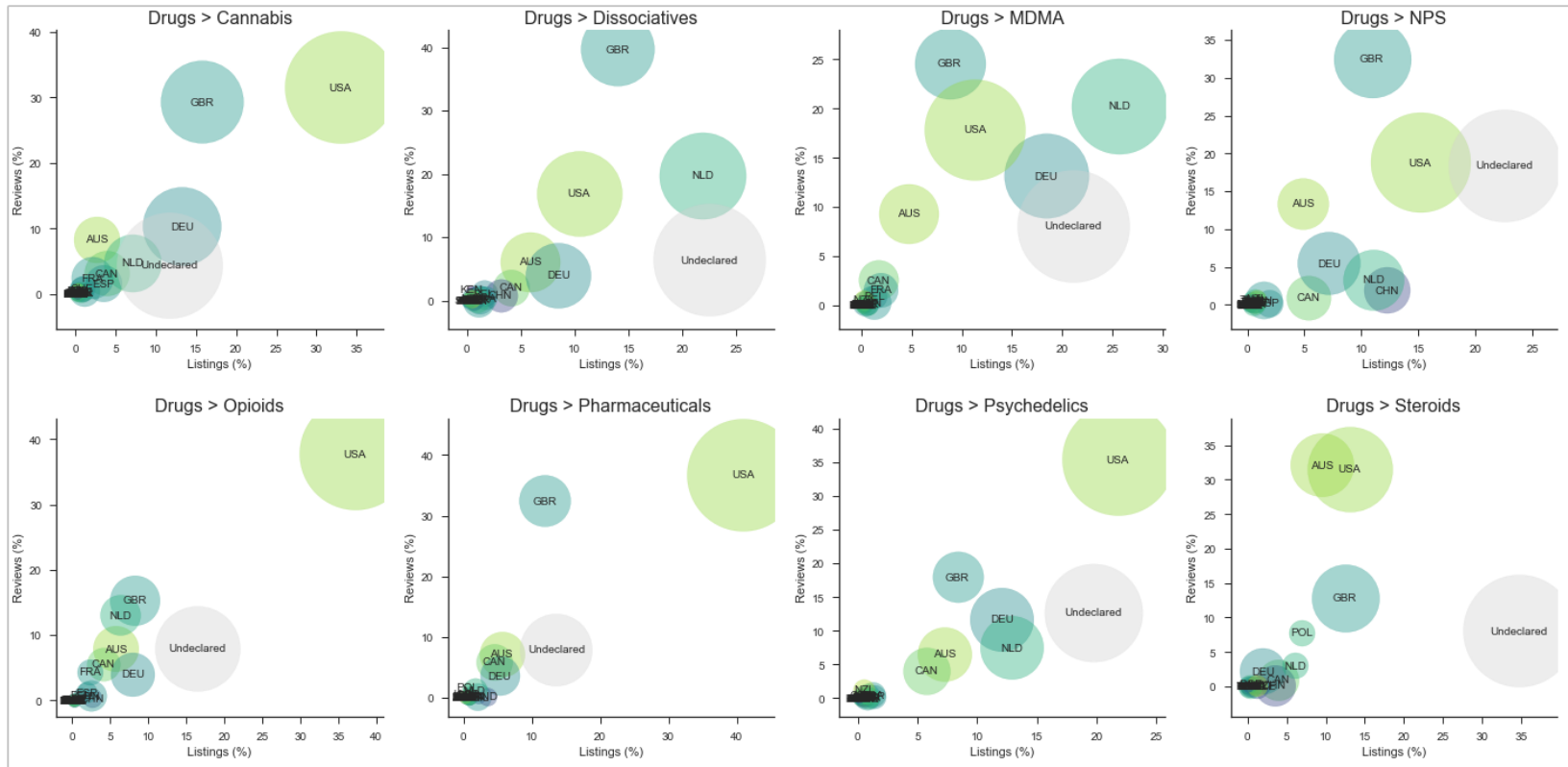
Some Weapons Trading, but not a Lot

Physical > Weapons

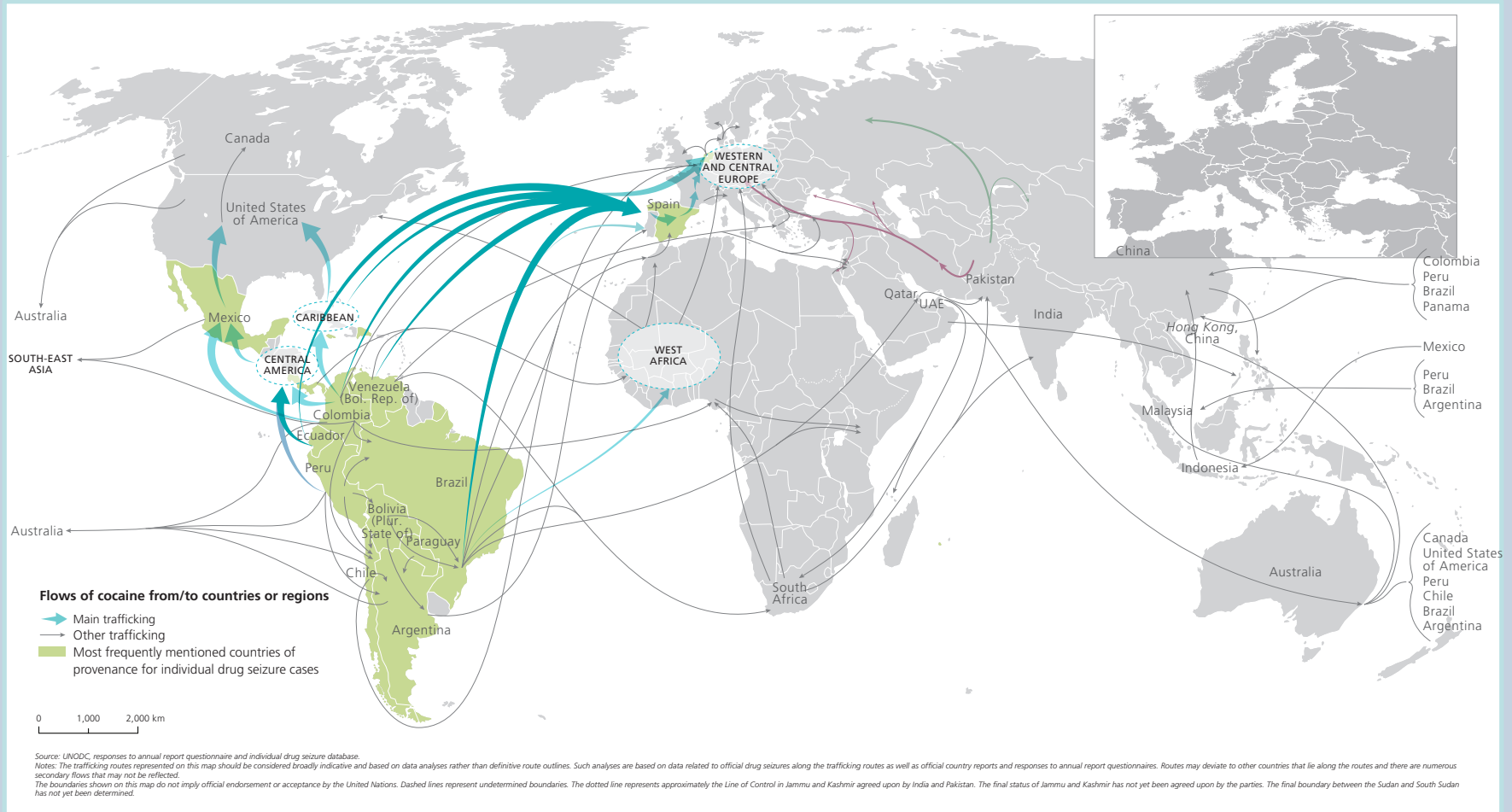
Total reviews



~5 Countries Provide Most of the Inventory



Cocaine Production in South America...

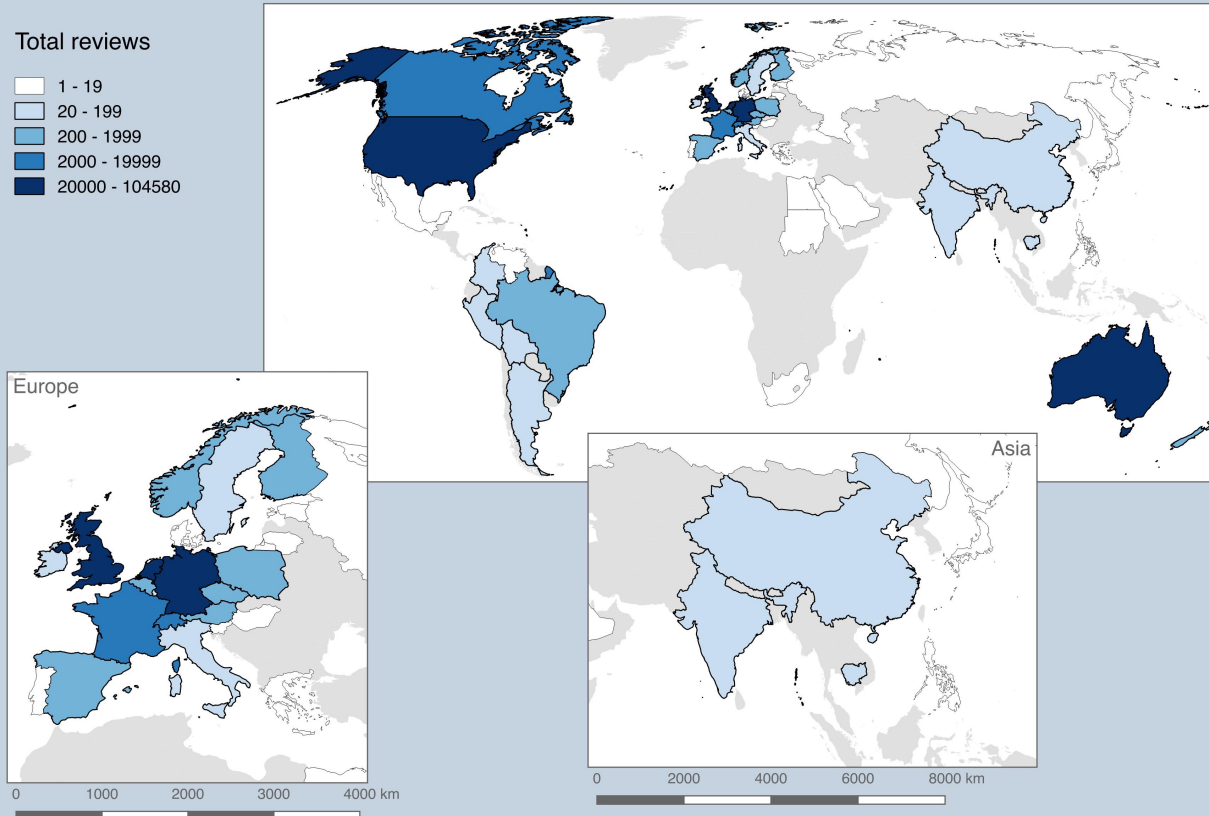
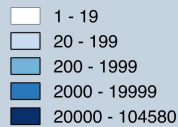


<http://www.unodc.org/wdr2016/>

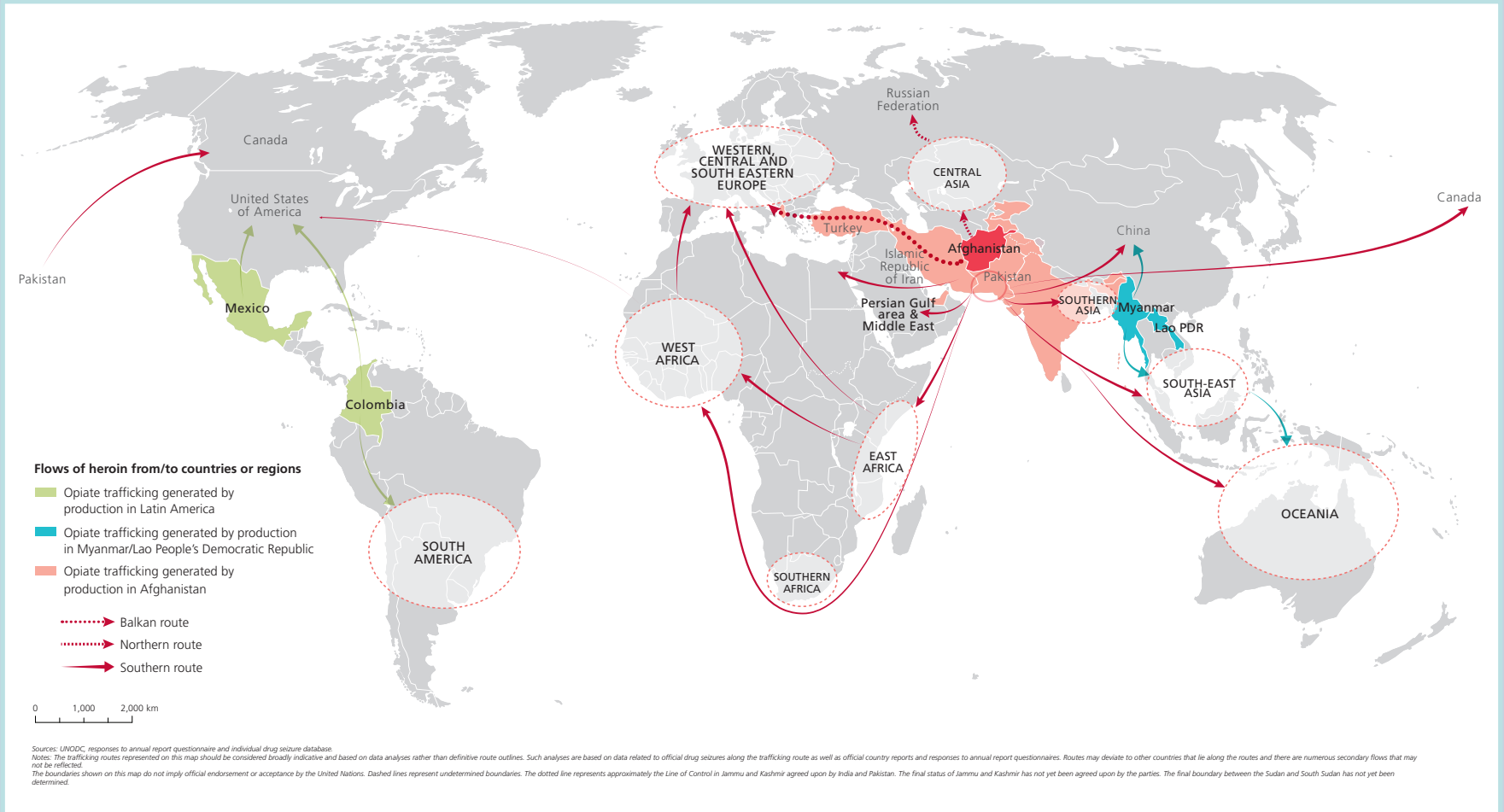
... While Cocaine Vendors on Darknet Markets are Situated in Buyer Locations

Drugs > Stimulants

Total reviews



Opium Production in Mexico, Afghanistan

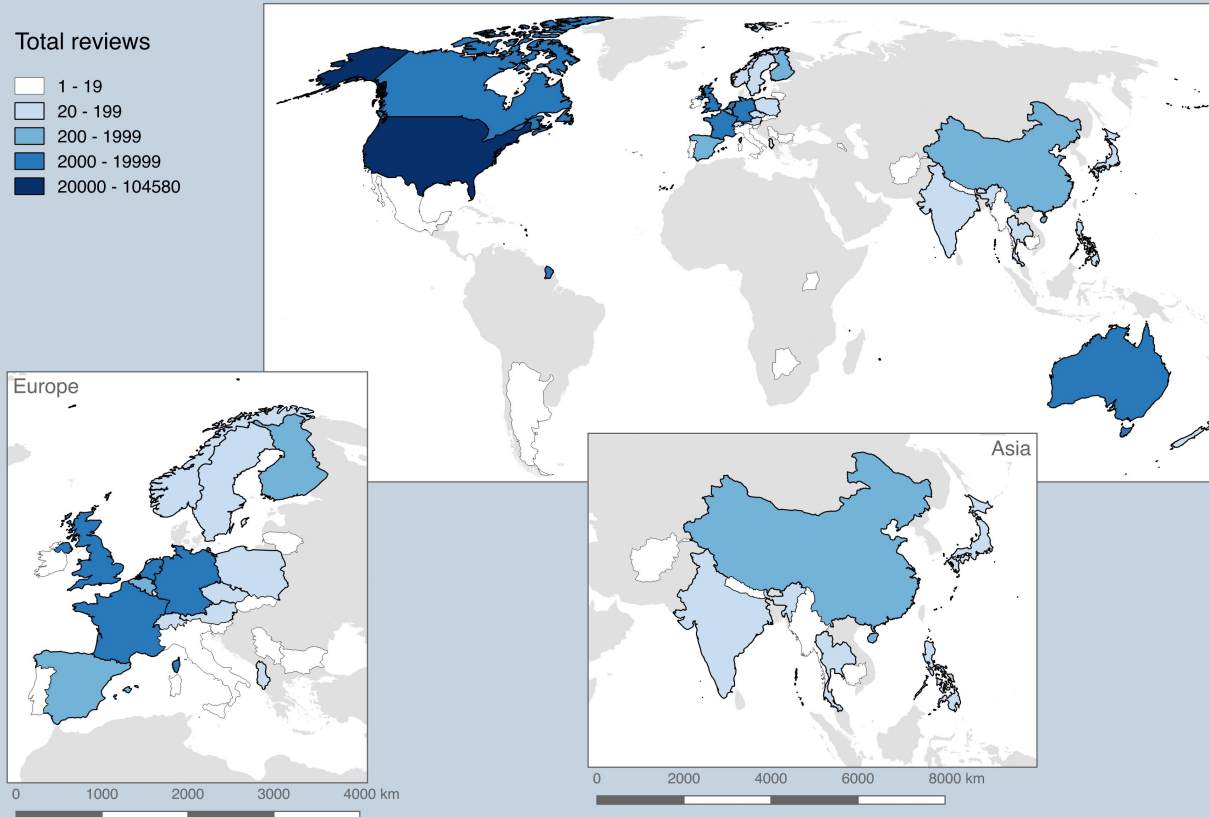
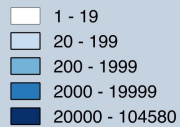


<http://www.unodc.org/wdr2016/>

... While Most Opiates on Dark Markets are Sold from Consumer Countries

Drugs > Opioids

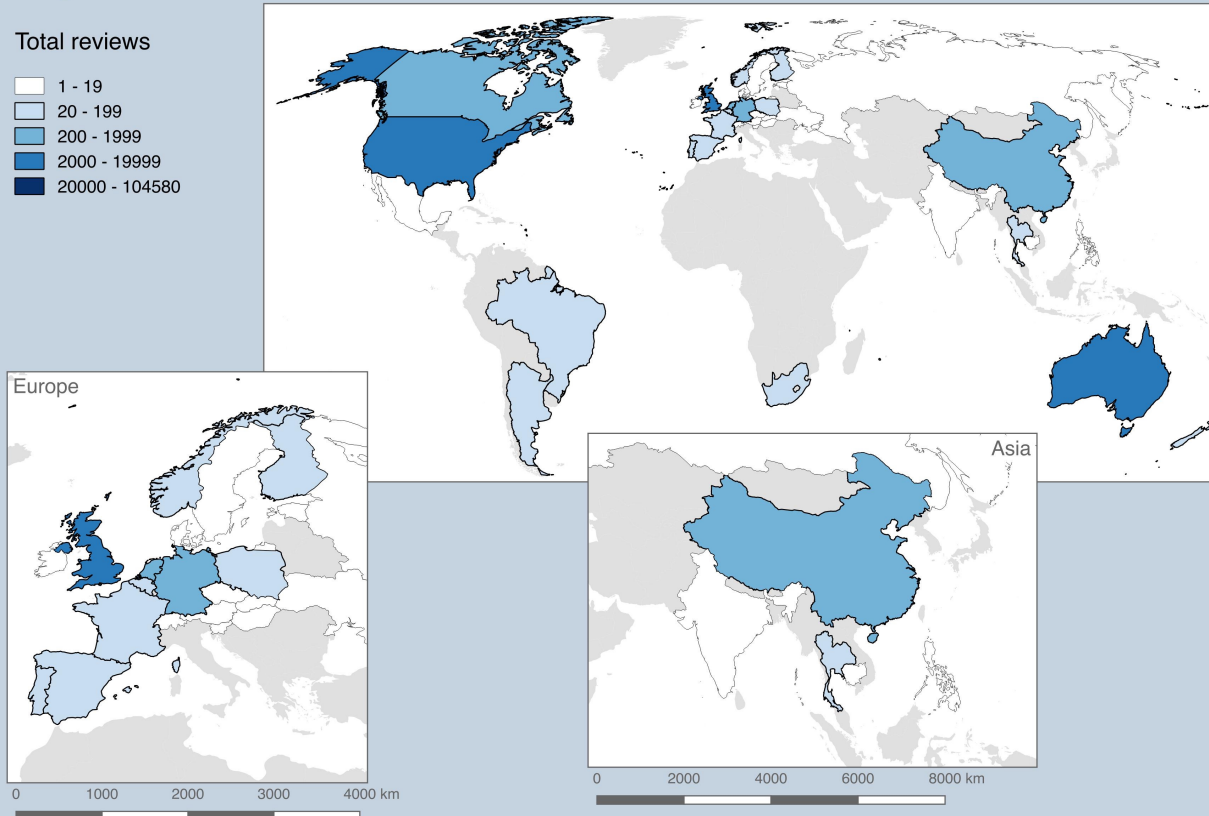
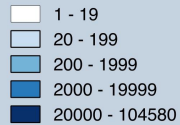
Total reviews



New Psychoactive Substances (NPS)

Drugs > NPS

Total reviews



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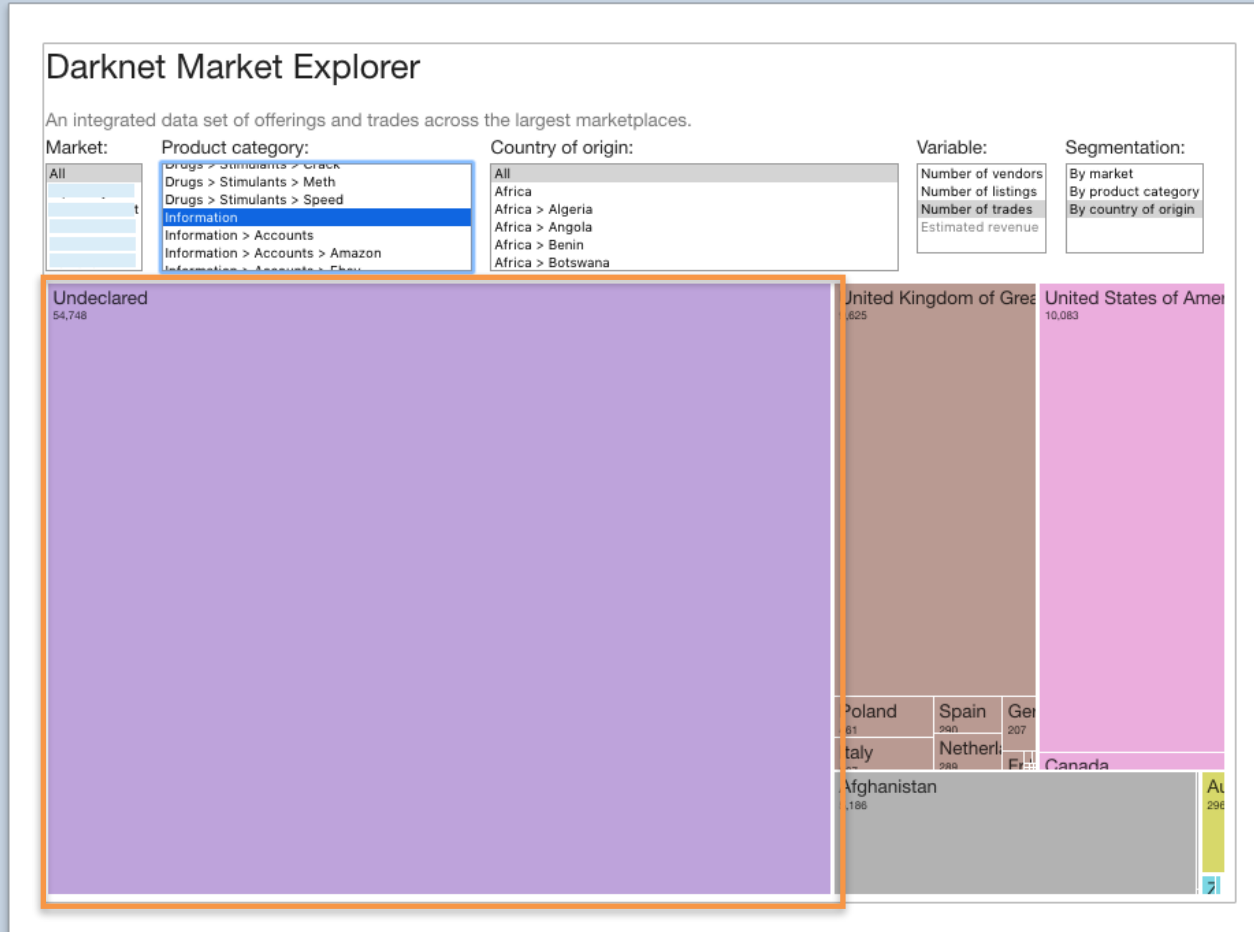


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No Need to Declare Country of Origin for Digital Information Goods: No Risk of Border Checks



Some Technical Details

- Many use curl and other basic crawlers
- This has now become less practical
 - An order of magnitude **more listings**
 - Need to carefully control **request rate**
 - Many intermittent **failure modes**: non-trivial retry logic
 - May need to **interrupt and resume** later
 - May want better **alerting** options
- Additionally, we only wanted a specific subset of the data: catalogues and trading indicators. No forum discussions, etc.
- We ended up using Scrapy. It's great!



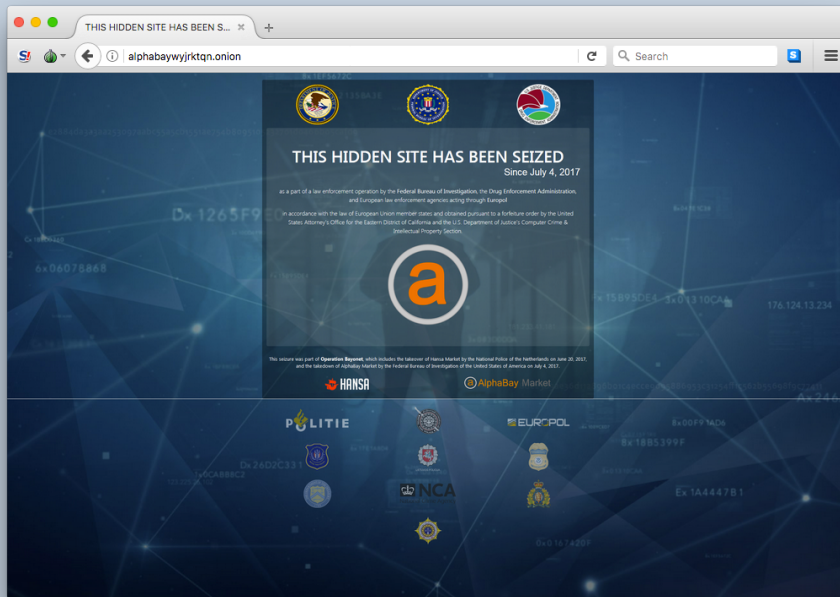
twitter.com/alecmuffett/status/901073569366634496



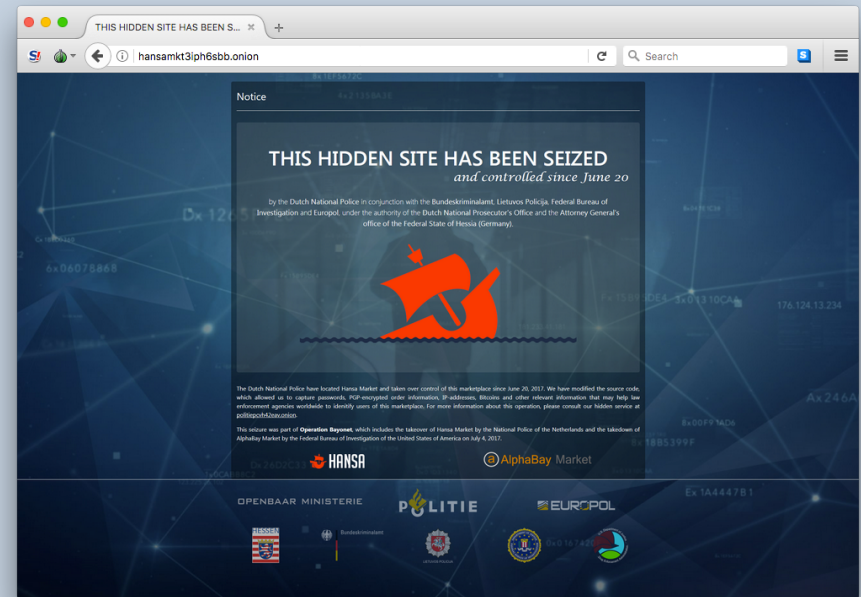
When your study population is taken down by the law...

Alphabay and Hansa Takedowns in July

Alphabay: 5th July



Hansa: 20th July



A Multi-stage Covert Attempt to Undermine Trust in Darknet Markets

FBI, DEA, Dutch National Police, Europol working together:

1. **Covertly took over Hansa**
2. Closed Alphabay on 5th July, the largest market at the time
3. As trading activity moved to Hansa: **secretly collected passwords and chat logs**
4. Took down Hansa on 20th July

The stated intention: to **harm trust in widely used markets.**

The screenshot shows a Europol press release page. The header includes the Europol logo and navigation links: ABOUT EUROPOL, ACTIVITIES & SERVICES, CRIME AREAS & TRENDS, PARTNERS & AGREEMENTS, CAREERS & PROCUREMENT, NEWSROOM, and PUBLICATIONS & DOCUMENTS. The main headline is "MASSIVE BLOW TO CRIMINAL DARK WEB ACTIVITIES AFTER GLOBALLY COORDINATED OPERATION" dated 20 July 2017. The text describes a coordinated law enforcement action in Europe and the US, led by the FBI, DEA, and Dutch National Police, with Europol support, targeting the infrastructure of underground criminal economies. It mentions the takedown of AlphaBay and Hansa, and quotes Rob Wainwright, Executive Director of Europol, and Dimitris Avramopoulos, European Commissioner for Migration, Home Affairs and Citizenship, regarding the significance of the operation.

<https://www.europol.europa.eu/newsroom/news/massive-blow-to-criminal-dark-web>

Ouch... impact for our research?

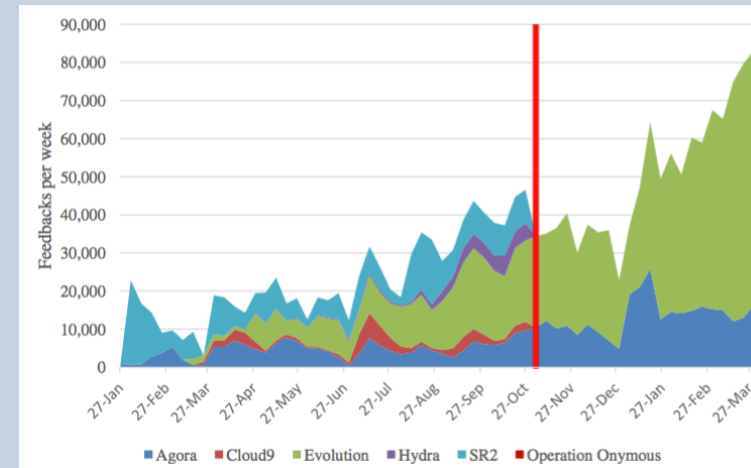
- **Having your data source suddenly disappear** is a worry for any long-term data scraping process...
- However in this case: opportunity to move beyond a simple observational study to a **quasi-experiment**. We can observe what happens in the overall marketplace after the external intervention.
- In this case: **how resilient are these marketplaces** to interference by law enforcement? Does trade actually go down, or simply move elsewhere?

Was it an effective deterrent?

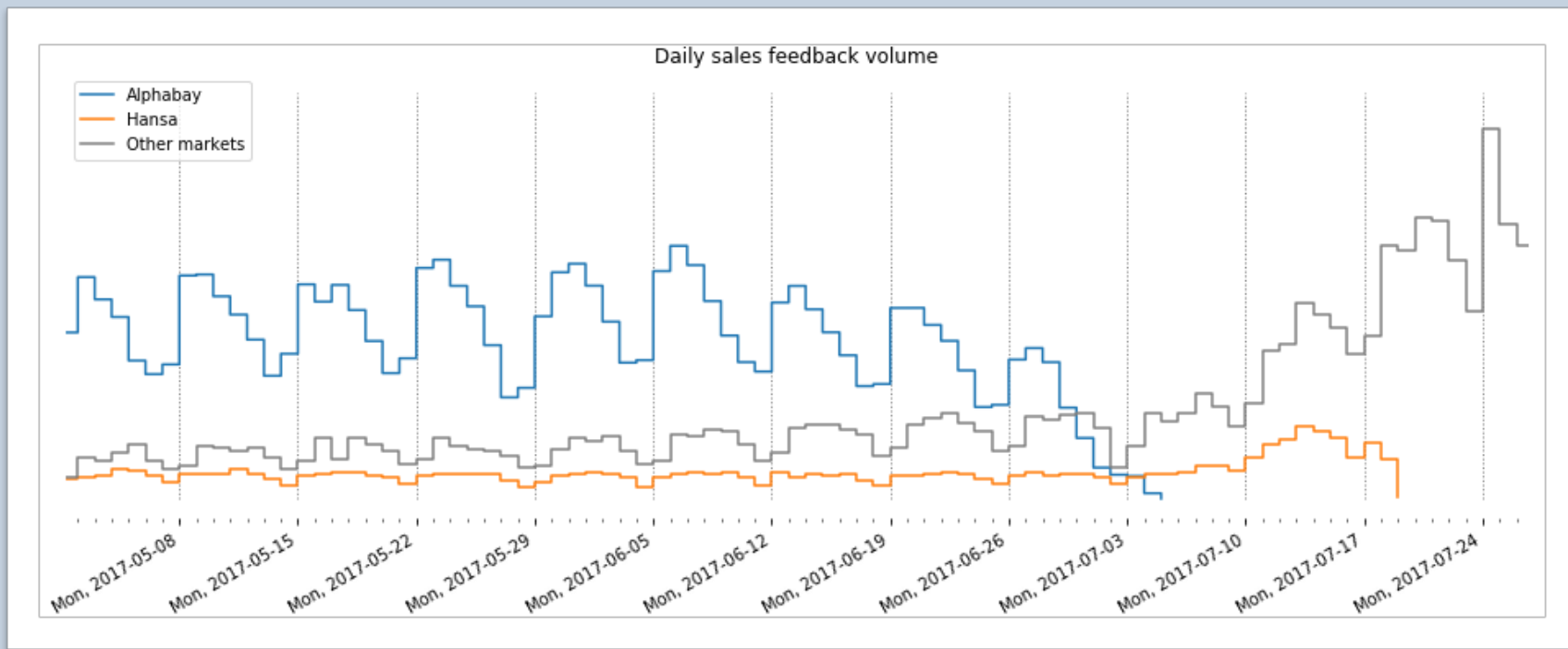


Prior Experience Suggests: Takedown Deterrent Might Not Last

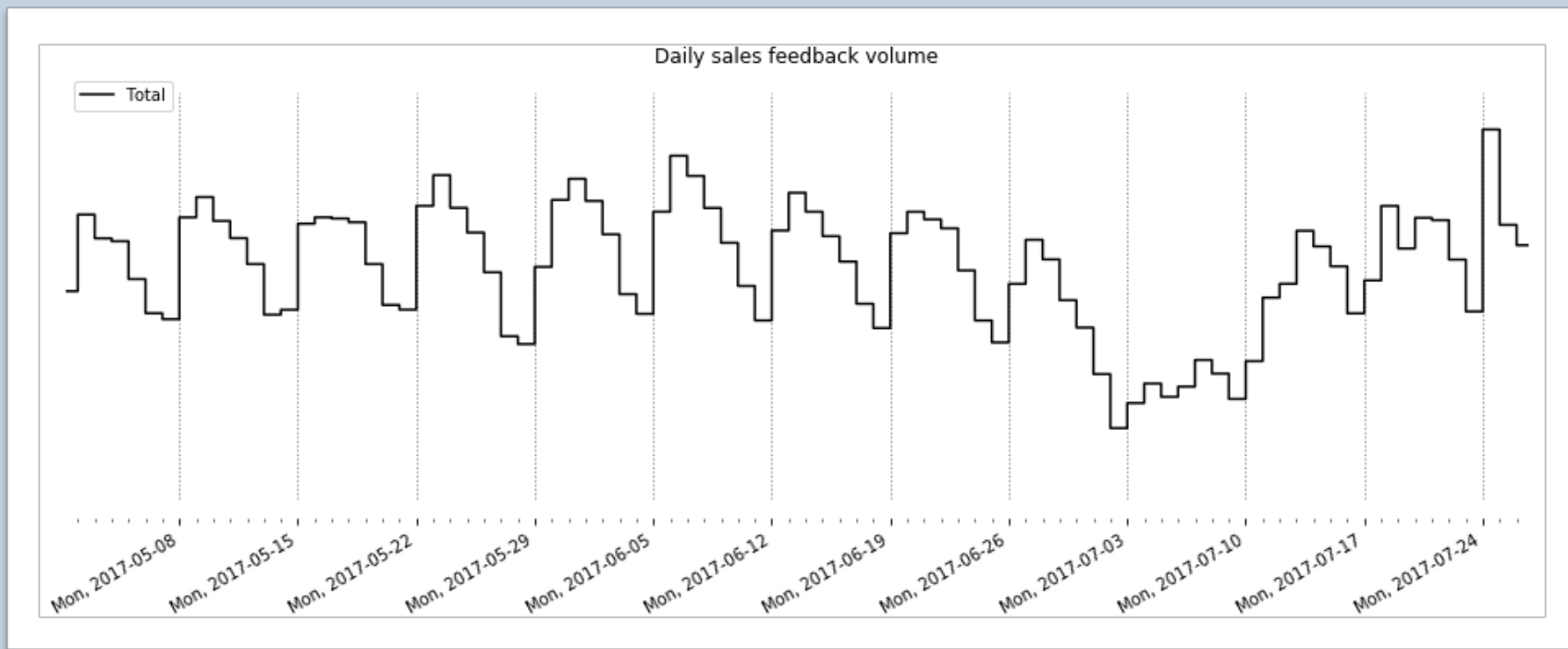
- Décary-Hétu & Giommoni (2016), “*Do police crackdowns disrupt drug cryptomarkets? A longitudinal analysis of the effects of Operation Onymous*”
- Initial effect:
 - **Most vendor accounts retired**, few moved to new markets.
 - Drop in overall sales.
- Within 1-2 months:
 - New vendor accounts appeared.
 - Product prices did not change.
 - **Overall sales increased!**



After Alphabay and Hansa Takedowns: Buyers Simply Moved to Other Markets



After Alphabay and Hansa Takedowns: Buyers Simply Moved to Other Markets



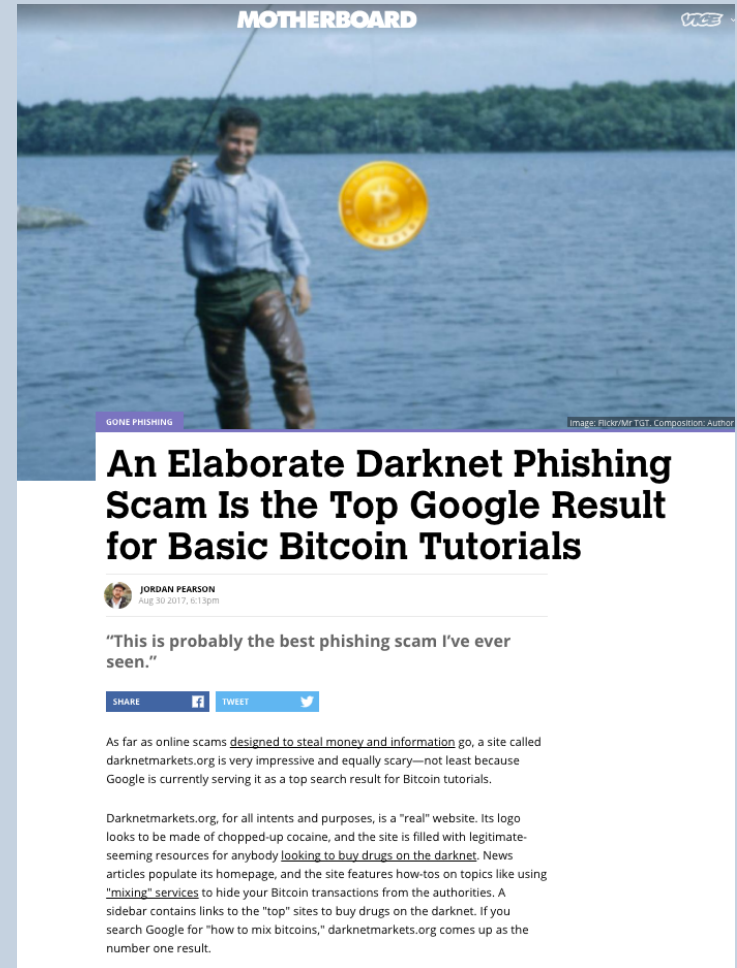
In closing, some security-related matters...

The Basic Infrastructure Proposition of These Markets

- **Electronic currency** to avoid identification
- **Buyer reviews** to establish trust
- Market resilience through **redundant market platforms** developed by independent actors
- An “**open innovation**” approach to iterative improvement
- Some **self-policing** to avoid raising too much attention. E.g. markets typically ban child porn. Some also ban fentanyl, weapons, etc.

But Also a Popular Target for Scams

- Dark markets have wide appeal, but a **high technical barrier** to entry. This yields opportunities for scams.
- Most recently: a **tutorial site** with instructions on **how to use darknet markets**. High pagerank, so people would find it easily.
- ... it sent people to a **fraudulent mixing service**.



https://motherboard.vice.com/en_us/article/d33ey7/an-elaborate-darknet

And Frequent Scams by Market Operators

- **Exit scams** and other market manipulations: a big incentive to take the money and run.
- Operators and moderators may **abuse their privileged positions**.
- A common approach: **occasional transgressions**. Not enough to undermine trust in the market itself.
- In other cases, **scammers can operate freely** on markets without interference by admins.

- scammer is part of the market staff [link](#)
- vendor doxes users and staff does nothing about it [link](#)
- many user accounts without 2FA compromised [link](#)
- does not ban busted and compromised vendors [link](#)
- several vendors suspiciously got hacked and staff does nothing about it [link](#)

Address: [\[redacted\]](#) | [\[redacted\]](#)
Multisig: No
Subreddit: No
Forums: [\[redacted\]](#)
Reddit accounts: [\[redacted\]](#)
PGP key: [\[redacted\]](#)

WARNINGS

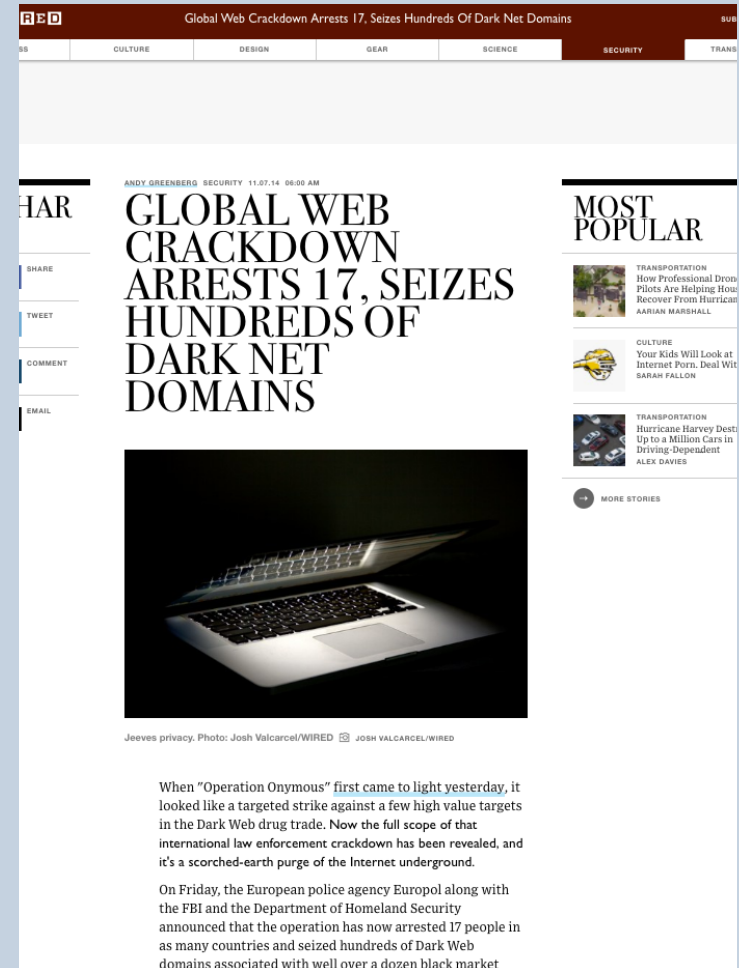
- allows doxing and scamming [link #1](#) | [link #2](#) | [example](#)
- allows distribution phishing link on the profile of that vendor (hover over the onion link and you see the phishing link in the bottom left corner)
- allows vendor impersonators [link](#) | [first affected vendor](#) | [second vendor](#)
- notorious non-responsive support

Reasons: the above warnings and non-responsive to contact requests by us mods
PGP key: [\[redacted\]](#)

Risk for Operators: Information Leaks Can Lead to Arrests

- Information security is hard. Market operators may not have sufficient **opsec experience**.
- Increasing law enforcement efforts to take down markets and big vendors.
- Common occurrence: **reused identities**, e.g. email addresses or aliases.

(But also suggestions that such instances can be the result of parallel construction efforts by law enforcement agents.)



The image is a screenshot of a Wired article. At the top, there is a navigation bar with categories: CULTURE, DESIGN, GEAR, SCIENCE, SECURITY, and TRANS. The article title is "GLOBAL WEB CRACKDOWN ARRESTS 17, SEIZES HUNDREDS OF DARK NET DOMAINS" by Andy Greenberg, dated 11.07.14 06:00 AM. Below the title is a large image of a laptop with a glowing keyboard. To the right of the article is a "MOST POPULAR" section with three small article thumbnails. Below the laptop image is a caption: "Jeeves privacy. Photo: Josh Valcarcel/WIRED". The main text of the article begins with: "When 'Operation Onymous' first came to light yesterday, it looked like a targeted strike against a few high value targets in the Dark Web drug trade. Now the full scope of that international law enforcement crackdown has been revealed, and it's a scorched-earth purge of the Internet underground. On Friday, the European police agency Europol along with the FBI and the Department of Homeland Security announced that the operation has now arrested 17 people in as many countries and seized hundreds of Dark Web domains associated with well over a dozen black market

<https://www.wired.com/2014/11/operation-onymous-dark-web-arrests/>

Insecure Dev Practices are Common

- A lot of **insecure coding practices** by inexperienced developers. Frequent XSS/injection vulnerabilities. (I've looked at a lot of markup. Impression: often not professional web developers.)
- **IP leaks: real or fake?** Recent reports that a market was leaking an IP address. A basic opsec transgression.

Some suggest: maybe a decoy?

Reasons: went offline with user's money probably due to the discovery of many XSS bugs, a private message leak and their test server being exposed on the clearnet
PGP key: [redacted]
Notes: removed August 22, 2017

Market Complaint: Accusation
Regarding [redacted] IP address exposure... I already pointed it out 9 months ago. And, it's a red herring.
submitted 1 month ago by [redacted]
I reported on this 9 months ago.
See for yourself:
[redacted]
I find it hilarious how much news is out there today about some other guys "discovery" - I already found it. And, [redacted] still exists. *it's a red herring.* [redacted] did it on purpose to mislead people. He's probably getting a laugh out of all the news being generated all over it. People only now care because the AB and Hansa takedowns. If it was a real finding, LE would have taken them down long ago because you know they on this subreddit 24/7.

Do Operators Even **Audit** their Platforms?

- An **inherent tension** between operator anonymity and common security practices: open code, external audits, ...
- Some markets introduced **bug bounties**.
<https://darkwebnews.com/darknet-markets/darknet-markets-bug-bounties/>
- A key moment to start paying attention: **when a big platform gets taken down**. People will flood to a smaller one. That market may not yet have spent time auditing their code.

A final request...

- Please *send me term lists for more software categories: hacking tools, keyloggers, ...*

Who catalogues such tools?

Thank You! Questions?



Martin Dittus, @dekstop
Joss Wright, @josswright
Mark Graham, @geoplace

The Economic Geography of Darknet Marketplaces Oxford Internet Institute

www.oii.ox.ac.uk/research/projects/economic-geog-darknet
@OiiDarknet