



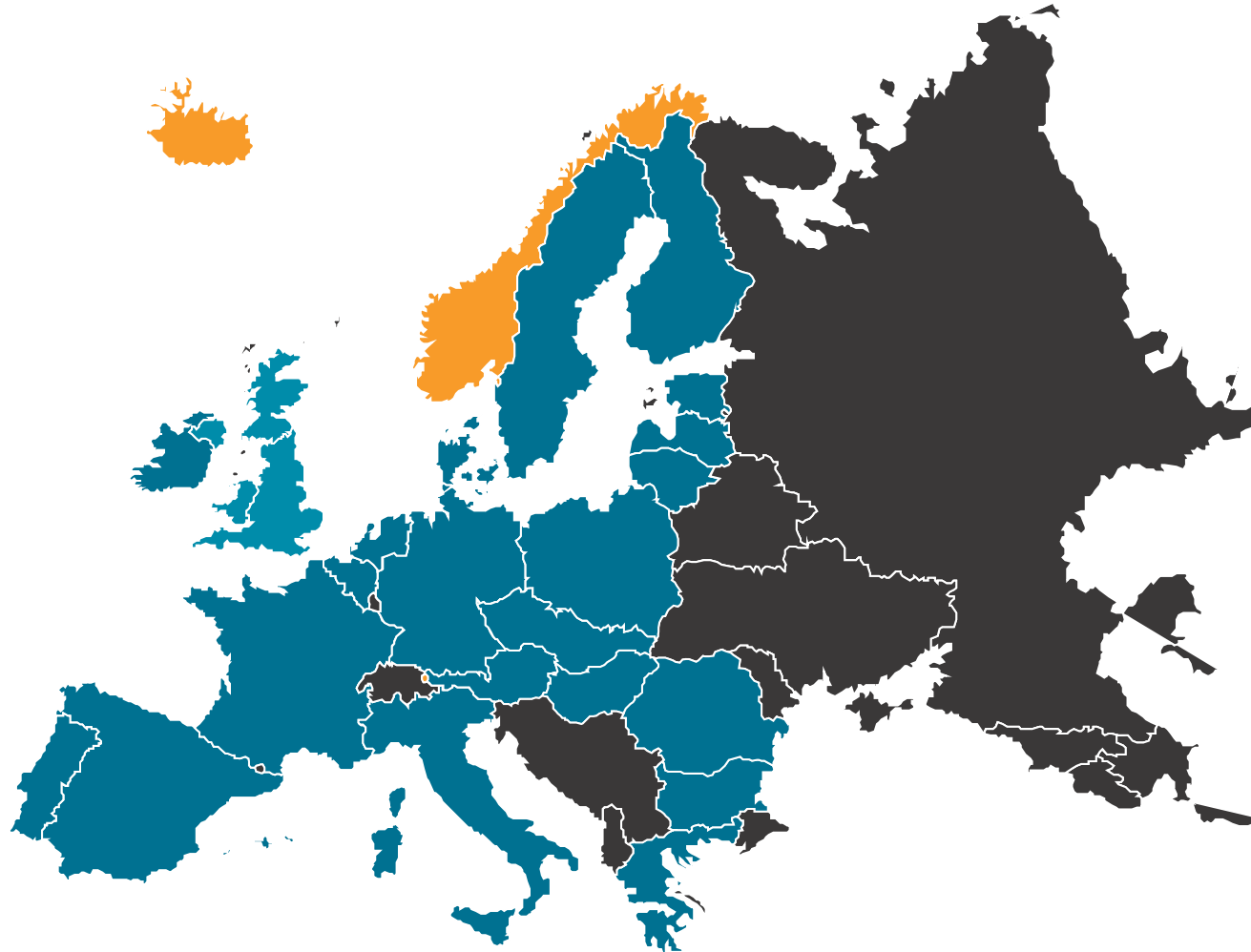
Data minimization & concentration: Intended and unintended consequences of the GDPR

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GDPR

General Data Protection Regulation



EU
EEA
Brexit





cost

processing
personal data



data

collection



data sharing

How could GDPR impact competition?

Consent

Easier for fewer firms
& recognizable firms

Consumer-driven

Economies of scale

Larger firms have
more resources for
compliance

Firm-driven

B2B vendor choices

Large vendors may
have:

- Better products
- Better regulatory compliance



May 25 '18

GDPR Enforcement deadline



Data: web tech vendors



SECTIONS

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THE MORNING CALL

FALL SALE
3 FREE MONTHS

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SATURDAY SEP. 22, 2018

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SPORTS

VARSITY

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REVIEWS

62°

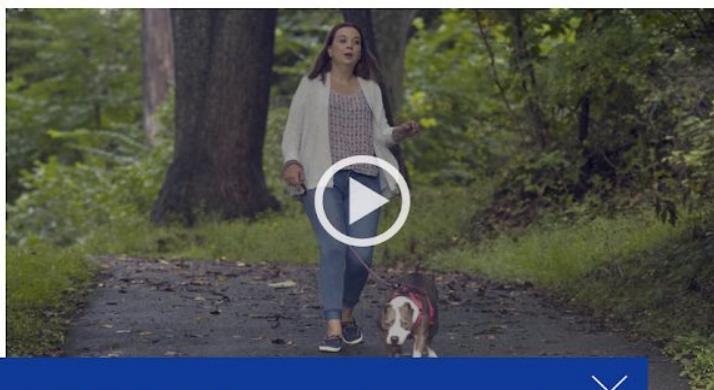
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Voices of Recovery: I know that it gets better

Jordan Scott knows what you see when you look at her now. You see a professional. A polished, punctual, well-dressed brunette strolling with her dog, Teaberry, who sports a pink collar. Scott knows that, if you saw her walking along Bethlehem's Broad Street, you would never guess she spent years...

GDPR Impact

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Hurry, offer ends 10/2

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THE MORNING
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GDPR Impact
Carson Wentz confident in shorthanded Eagles offense

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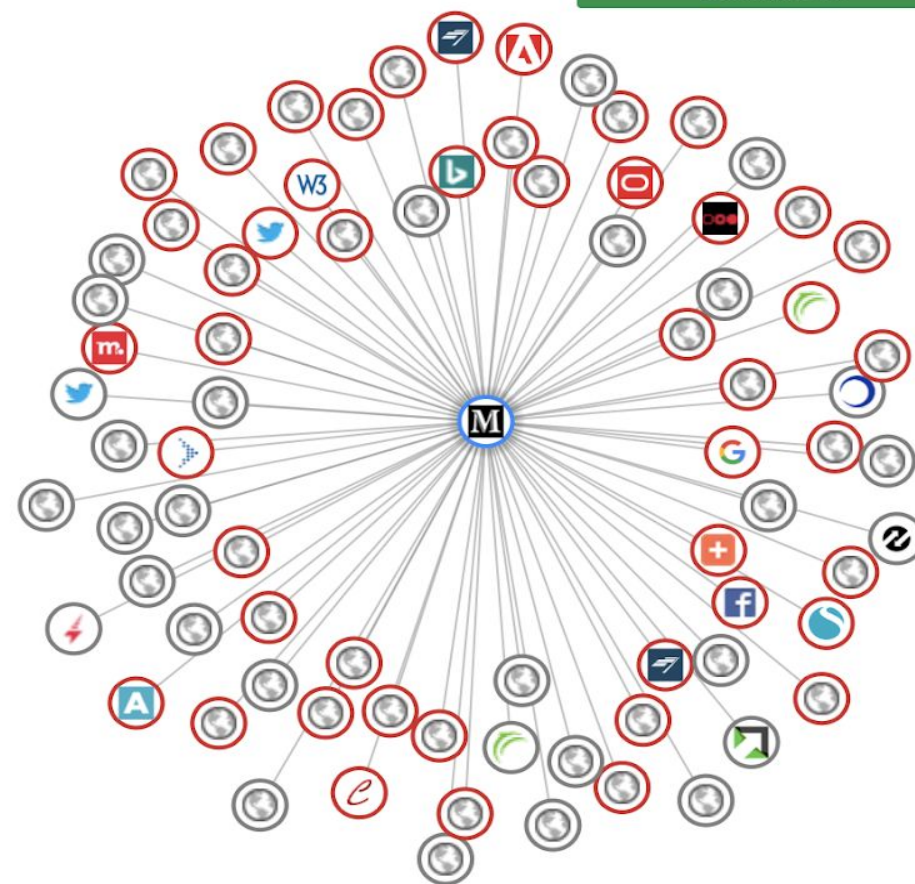
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27K top sites

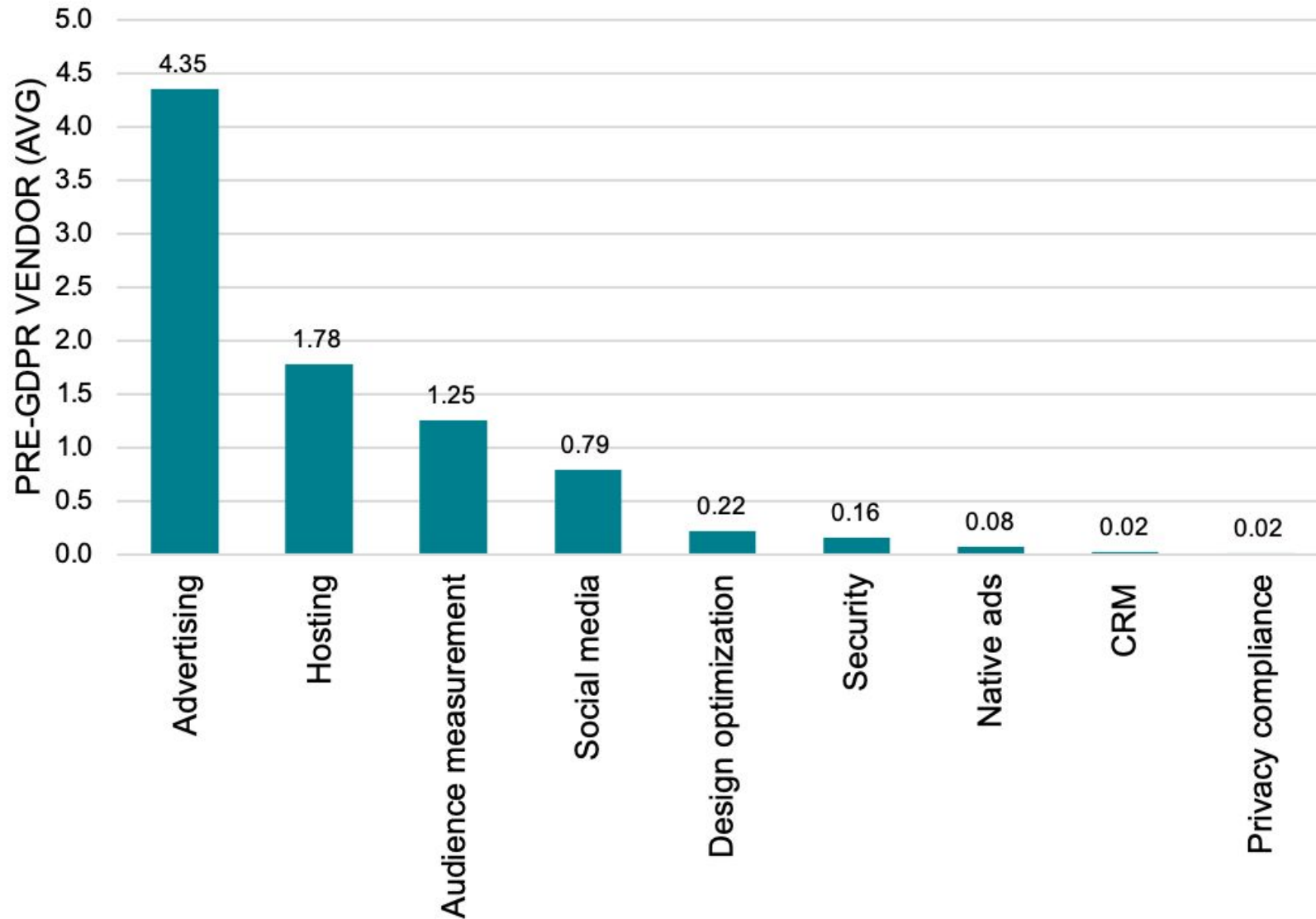


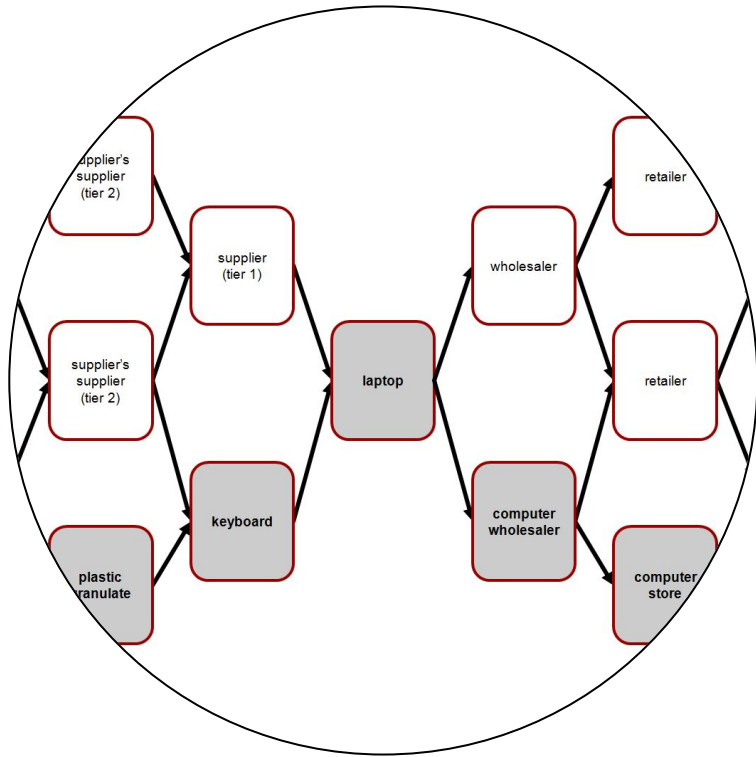
Data: 3rd party domains on top websites

- **Method:** Libert (2015) "webxray" python program
 - Records all 3rd party domains when visiting website
 - VPN service simulates EU user (France)
 - No interaction with site: no consent given
- **Panel:** Top 2,000 websites in each of 28 EU countries, US, Canada, and globally according to Alexa (28.2K unique sites)
 - Pre-GDPR: Days before May 25, 2018
 - Post-GDPR: Weekly for six weeks, biweekly for the next six weeks, every four weeks through 2018
 - **27.3K** sites ever scan & remaining panel is 96.4% complete

Vendors by category (pre-GDPR)

Categorized using the Libert (2019) third party domain database

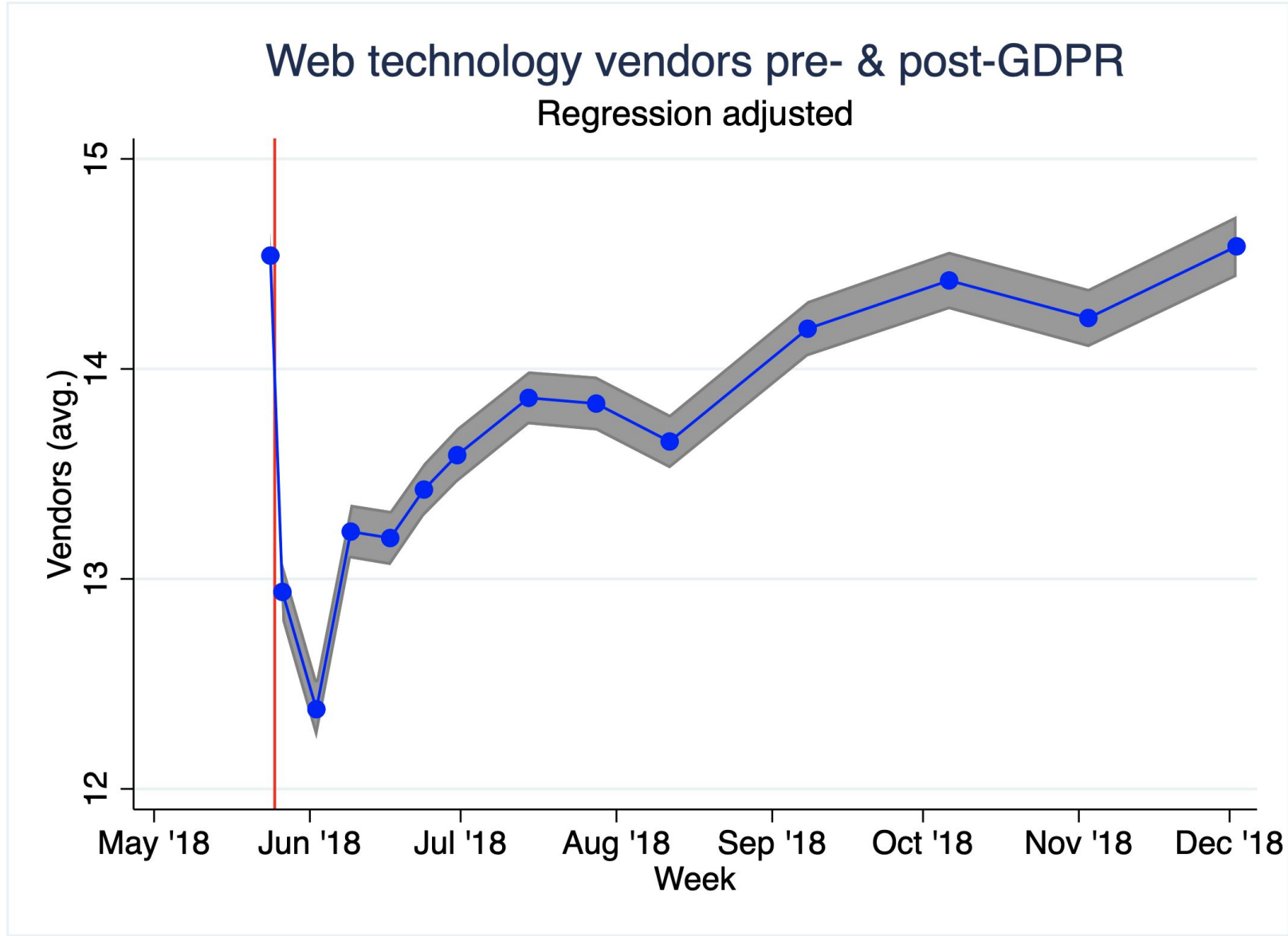




GDPR impact on webtech vendors

Short run: webtech vendors fall 15% post-GDPR

Short run = full week after enforcement deadline vs pre-deadline baseline



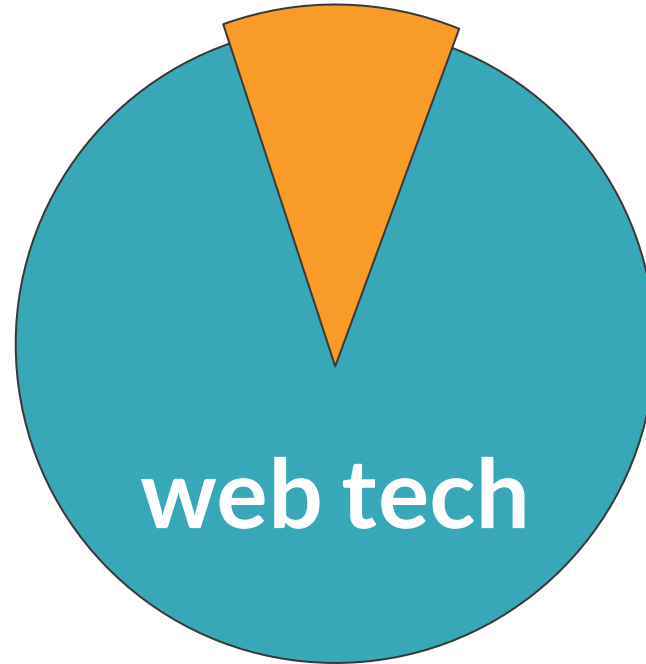
Fewer vendors in all categories but compliance

Short run estimates: 1 week post-GDPR

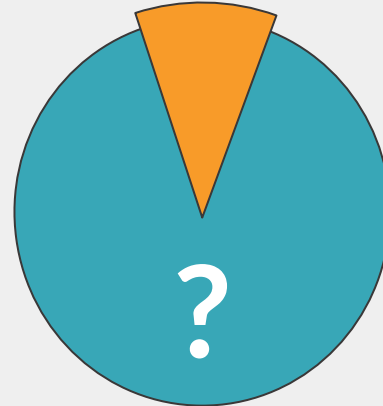
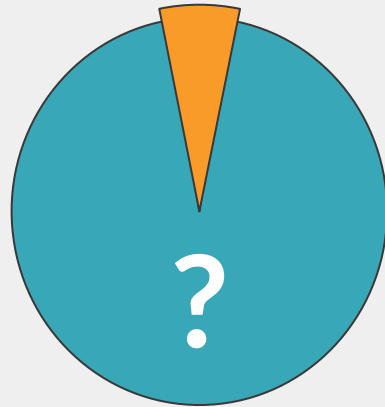
Category	Avg. Vendors		
	Pre	Post	Diff. (%)
All vendors	14.44	12.35	-14.5%
All categorized vendors	8.40	6.91	-17.7%
Advertising	4.35	3.29	-24.3%
Hosting	1.78	1.61	-9.7%
Audience measurement	1.25	1.11	-10.9%
Social media	0.79	0.70	-11.5%
Design optimization	0.22	0.20	-10.5%
Security	0.15	0.12	-17.8%
Native ads	0.078	0.066	-14.8%
CRM	0.022	0.019	-9.6%
Privacy compliance	0.017	0.021	23.2%

Do larger vendors get a larger share of the smaller pie?

Pre-GDPR



Post-GDPR



Defining relative market concentration

- **Reach:** # of websites using vendor
- **Vendor's relative market share:**

$$\text{market share} = \text{own-reach} / \sum \text{reach}$$

- **Herfindahl–Hirschman Index (HHI):**

$$\sum \text{market share}^2$$

- HHI varies from 0 (perfect competition) to 10,000 points (monopoly)
- Note: If all vendors fall by same %, relative HHI is invariant

↑ concentration in top 4 categories (94.3% of vendors)

Category	Vendor Share (Pre)	HHI		
		Pre	Post	Diff. (%)
All vendors		146	171	17.3%
All categorized vendors		308	363	17.8%
Advertising	50.2%	348	436	25.3%
Hosting	20.5%	1,892	1,936	2.3%
Audience measurement	14.4%	4,116	4,355	5.8%
Social media	9.2%	4,251	4,412	3.8%
Design optimization	2.6%	2,874	2,861	-0.5%
Security	1.8%	8,926	9,722	8.9%
Native ads	0.9%	4,229	4,024	-4.8%
CRM	0.2%	6,408	6,119	-4.5%
Privacy compliance	0.2%	3,925	4,116	4.9%

Extension: Personal data concentrated in top vendors

Data samples	HHI Pre	HHI Post	Diff.	Diff. (%)
<i>Role of personal data</i>				
Likely personal data	187.0	231.5	44.5	23.8%
Unlikely personal data	360.0	378.1	18.1	5.0%

Extension: Consent does not drive ↑ concentration

Less surprising because most consent popovers bury vendor list

Data samples	HHI Pre	HHI Post	Diff.	Diff. (%)
<i>Role of personal data</i>				
Likely personal data	187.0	231.5	44.5	23.8%
Unlikely personal data	360.0	378.1	18.1	5.0%
<i>Role of consent</i>				
Sites using consent platform	100.1	117.9	17.8	17.8%
Sites without consent platform	153.6	179.4	25.8	16.8%

Extension: Google & Facebook drive ↑ concentration

Data samples	HHI Pre	HHI Post	Diff.	Diff. (%)
<i>Role of personal data</i>				
Likely personal data	187.0	231.5	44.5	23.8%
Unlikely personal data	360.0	378.1	18.1	5.0%
<i>Role of consent</i>				
Sites with privacy extension	100.1	117.9	17.8	17.8%
Sites without privacy extension	153.6	179.4	25.8	16.8%
<i>Role of top 2 companies (Google & Facebook)</i>				
All vendors	145.7	171.0	25.2	17.3%
All but top 2 companies	46.0	43.2	-2.8	-6.2%

"Nobody gets fired
for choosing IBM"

"Nobody gets fired
for choosing ~~IBM~~"

Google

facebook®

Summary: GDPR often ↑ market concentration

- **Intended consequence:** ↓ web tech data sharing
- **Unintended consequences:** ↑ web tech concentration
 - ↑ concentration of online personal data pool
- Novel empirical evidence of **privacy-competition tension**
 - GDPR does not *always* ↑ concentration
 - But, ↑ **concentration in top 4 categories** (94.3% of vendors)
- **Mechanism:**
 - ✓ Big 2: Google & Facebook
 - ✓ Vendors (likely) processing personal data
 - ✗ User consent

THE CONCENTRATION IS



TOO DAMN HHI

