

#### Shrinking Shelf: The Effects of Digital Regulation on Amazon

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## Research question

- We study how product offerings on Amazon have changed with DMA & DSA
  - DMA limits self-preferencing and requires data sharing
  - DSA imposes liability, traceability, and product safety obligations
- Broader focus than competition policy
  - Interaction between competition policy, IP and concerns about product safety
- Large-scale scrape of Amazon stores inside and outside of EU,
   Diff-in-Diff leveraging implementation timing of DMA and DSA

# Understanding the setup

## Amazon and Digital Market Regulation

#### DMA (competition focus)

 bans self-preferencing, restricts data use, and forces fair access to ad and business-user data

#### DSA (safety & liability focus)

 seller traceability (KYBC), product safety checks, stronger IP enforcement, and systemic risk duties.

#### Implication for Amazon

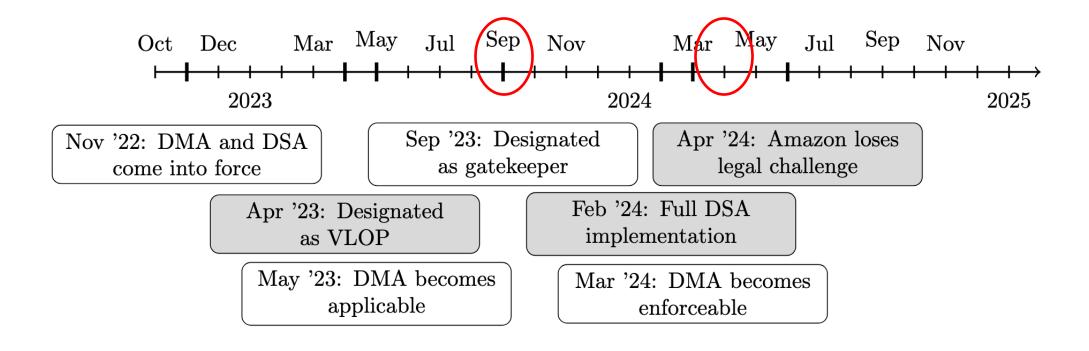
 regulations target both how Amazon ranks its own offers and which products/sellers can appear at all.

#### Literature review

- A lot of empirical research (14 papers and counting) on impact of the DMA
  - Chen & Tsai (2023); Crawford et al. (2022); Farronato et al. (2023); Gutierrez (2023); Hunold et al. (2023); Jürgensmeier & Skiera (2023); Lee & Musolff (2023); Raval (2023); Waldfogel & Reimers (2023); Dash et al. (2024), Waldfogel (2024), Farronato et al. (2025); Püplichhuisen and Sirries (2025), Pape and Rossi (2025)
- Kaushal et al. (2024) study the DSA transparency database and document many actions taken by VLOPs, but, so far, no DSA impact assessments (that we know of)

# EU Store Transparency Report

## Timeline of events impacting Amazon



- Fines in 2019 & 2022 over abusive clauses with 3<sup>rd</sup> party-sellers
- No PPCs in 2013; commitments in 2019; paramount significance since Jul 2022\*, lost legal challenge in Apr 2024
- Investigation by CMA in July 2022, commitments by Nov 2023 on buy box, marketplace data and delivery rates
- FTC (& 17 state AGs) sued Amazon in Sep 2023 (Amazon announced in Aug 2023 to reduce private labels)

### Data

#### Data

- Scrapes: bi-weekly from April 2023 to the present day
  - Amazon Germany, France, UK and US
- 1,643 queries, in 38 distinct categories (avg. 59 queries per category)
  - search term (e.g., Gucci in Luxury Handbag)
- 2.4m distinct products **& Keepa**
- Because of variation in the search results, we also study a "balanced panel" of the same products across all countries over time



# Empirical strategy

Difference-in-difference (DID): Compare queries (or products) in EU with non-EU around the DSA/DMA policy change

$$Y_{i,c,t} = \beta_0 + \beta_1 E U_{i,c} \times Post_{i,c,t} + X_{i,c,t} + \mu_{cat} + \mu_t + \varepsilon_{i,c,t}$$

Y = # products or # sellers, EU = EU Dummy, Post = Post-Period Dummy, X = control variables, mu\_cat = category FE, mu\_t = month FE, i = query, c = country, t = time

#### Product categories with special DSA relevance









**Child Car Seats** 

UNECE Reg. 129 ("i-Size"), UNECE Reg. 44.04

Life Jackets

Reg. (EU) 2016/425 (PPE), EN ISO 12402 series

**Luxury Watches** 

Trademark

Toys (Brick Toys)

Trademark / Design

Defines crash test, size/weight classes, and installation standards. Mandatory use of approved child seats across EU.

Defines buoyancy categories (100 N/150 N/275 N) and test methods for leisure and professional use.

Rolex v. eBay – Rolex successfully pushed for stricter anti-counterfeit measures.

Lego v. OHIM – ECJ refused trademark for functional brick shape, but minifigure protected.











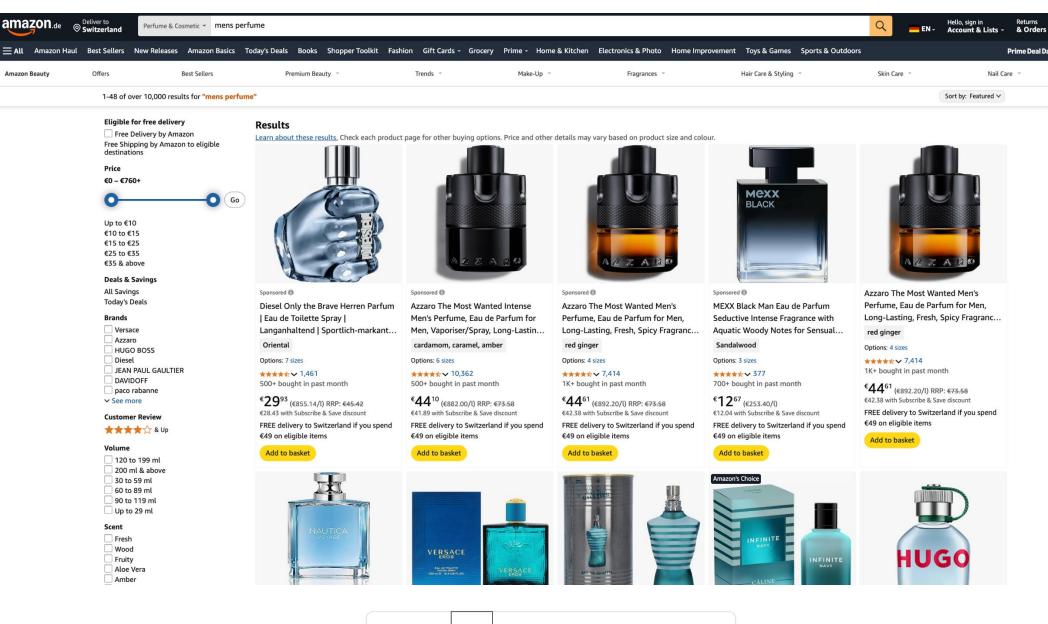






# Preliminary results

>>> Search results



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#### Number of products decreases

	Pages	Products	Products/Page
	(1)	(2)	(3)
$EU \times Post DMA$	-0.1422***	-0.1990***	-1.9992***
	(0.01500)	(0.01593)	(0.19920)
$\mathrm{EU} \times \mathrm{Post} \ \mathrm{DSA}$	0.0022	-0.1059***	-4.2758***
	(0.01337)	(0.01404)	(0.17930)
Query FE	Yes	Yes	Yes
Category FE	Yes	Yes	Yes
Country FE	Yes	Yes	Yes
Observations	31,953	31,953	31,953

Products:

About 18% decrease after DMA: from 6.4 to 5.2 pages

Another 10% decrease after DSA

Products per page:

From 40.4 to 36.1 after DSA

Note: The dependent variable in column (1) is the log number of pages per search query, in column (2) it is the log number of products (unique ASIN) per search query, and in column (3) it is the number of products per result page per query. EU indicates whether the search was carried out on amazon.de or amazon.fr, compared to amazon.co.uk and amazon.com.  $Post\ DMA$  indicates months after September 2023,  $Post\ DSA$  indicates months after February 2024. All specifications include fixed effects for the search query, product category and country. We report robust standard errors in parentheses. \* p < 0.10, \*\* p < 0.05 \*\*\* p < 0.01

## Number of products decreases

	Products (1)	(2)
$EU \times Post DMA$	$-0.2542^{***}$ (0.04598)	$-0.2571^{***}$ (0.05243)
$\mathrm{EU} \times \mathrm{Post} \ \mathrm{DMA} \times \mathrm{Safety}$	0.1051 $(0.08488)$	
$EU \times Post DSA$	-0.0703 $(0.05226)$	-0.0699 (0.05832)
$EU \times Post DSA \times Safety$	-0.1500** (0.07530)	
$\mathrm{EU} \times \mathrm{Post} \ \mathrm{DMA} \times \mathrm{High} \ \mathrm{IP}$		-0.0030 (0.06633)
$\mathrm{EU} \times \mathrm{Post} \; \mathrm{DSA} \times \mathrm{High} \; \mathrm{IP}$		-0.0232 $(0.05577)$
Query FE Category FE Country FE Observations	Yes Yes Yes 18,660	Yes Yes Yes 16,344

The DMA decrease is not concentrated in IP and safety related products.

The DSA decrease is driven by safety related products.

>>> Product level

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#### DOLCE & GABBANA, The One For Men Eau De Toilette 100ml

Brand: Dolce & Gabbana

4.6 ★★★★★ **∨** 471 ratings

100+ bought in past month

€5809 (€580.90 / I)

Prices for items sold by Amazon include VAT. Depending on your delivery address, VAT may vary at Checkout. For other items, please see details.

Brand Dolce & Gabbana

Item form Liquid

Item volume 3.3 Fluid Ounces

Scent Wood Special feature Travel Size

#### About this item

- · Intense men's fragrance
- · Keeps you cool and comfortable
- · Brings you an extra comfort
- Durable
- · Flexible design

#### Top Brand Dolce & Gabbana

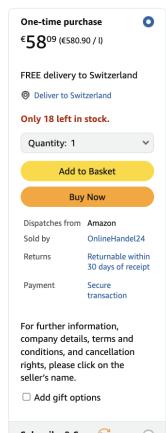


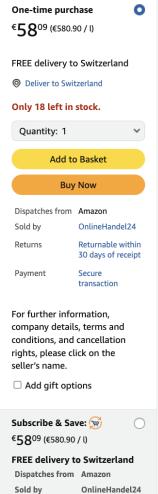




New (5) from <sup>€</sup>63<sup>95</sup>

>





DOLCE & GABBANA, The One For Men Eau De Toilette 100... \*\*\*\* 471 ratings

New €5809 (€580.90 / l)

Add to Basket

See more

4 other options

sorted by price + delivery: low to high

Filter 🗸

Add to Basket

Add to Basket

New

€6932

(€693.20 / l)

Dispatches from Amazon Sold by Amazon Return policy

New

€6689 €12.99 delivery 4 - 21 October. Details

Dispatches from Glamstore DE

Dispatches from United Kingdom.

Sold by Glamstore DE

\*\*\* ↑ (754 ratings)

66% positive over last 12 months

Return policy

New

€6499 €32.63 delivery 29 September - 2

Add to Basket

(€649.90 / l)

Dispatches from BF Beauty Farm e.K

Dispatches from Germany.

October. Details

BF Beauty Farm e.K Sold by

\*\*\*\* (7092 ratings) 96% positive over last 12 months

Return policy

New

(€799.90 / l)

€7999 €32.63 delivery 29 September - 2

October. Details

Dispatches from BF Beauty Farm e.K

Dispatches from Germany.

Sold by BF Beauty Farm e.K

> \*\*\*\* (7092 ratings) 96% positive over last 12 months

Return policy

Add to Basket

## Number of sellers per product decreases

	Sellers (1)	(2)	(3)
$\mathrm{EU} \times \mathrm{Post} \ \mathrm{DMA}$	$-0.0726^{***}$ (0.00517)	-0.0970*** (0.01194)	-0.0842*** (0.01536)
$EU \times Post DSA$	0.0044 $(0.00750)$	0.0087 $(0.01589)$	0.0279 $(0.02123)$
$EU \times Post DMA \times Safety$		$0.1223^{***}$ (0.02855)	
$\mathrm{EU} \times \mathrm{Post} \ \mathrm{DSA} \times \mathrm{Safety}$		-0.0230 $(0.04228)$	
$\mathrm{EU} \times \mathrm{Post} \ \mathrm{DMA} \times \mathrm{High} \ \mathrm{IP}$			0.0154 $(0.02046)$
$\mathrm{EU} \times \mathrm{Post} \ \mathrm{DSA} \times \mathrm{High} \ \mathrm{IP}$			-0.0395 (0.03137)
Query FE	Yes	Yes	Yes
Category FE	Yes	Yes	Yes
Country FE	Yes	Yes	Yes
Observations	86,332	68,948	60,044

About 7% decrease after DMA: from 5.2 to 4.6 sellers

>>> Buy box

#### ф

#### DOLCE & GABBANA, The One For Men Eau De Toilette 100ml

Brand: Dolce & Gabbana

4.6 ★★★★★ **∨** 471 ratings

100+ bought in past month

€**58**09 (€580.90 / l)

Prices for items sold by Amazon include VAT. Depending on your delivery address, VAT may vary at Checkout. For other items, please see details.

Brand Dolce & Gabbana

Item form Liquid

Item volume 3.3 Fluid Ounces

Scent Wood

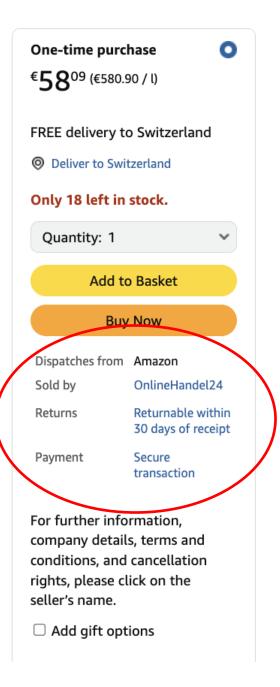
Special feature Travel Size

#### About this item

- · Intense men's fragrance
- Keeps you cool and comfortable
- Brings you an extra comfort
- Durable
- Flexible design

#### Top Brand Dolce & Gabbana

- 94% positive ratings from 1K+ customers
- 10K+ recent orders from this brand



## Amazon's presence in the buy box changes

	Amazon in Buybox?	
	(1)	(2)
$EU \times Post DMA$	0.0082*** (0.00064)	0.0261*** (0.00045)
$EU \times Post DSA$	-0.0179*** (0.00093)	-0.0111*** $(0.00072)$
EU $\times$ Post DMA $\times$ AMAZON present before		-0.0216*** (0.00087)
$\mathrm{EU} \times \mathrm{Post} \ \mathrm{DSA} \times \mathrm{AMAZON} \ \mathrm{present} \ \mathrm{before}$		-0.0001 $(0.00133)$
Product FE		Yes
Country FE		Yes
Observations	27,331,278	27,321,388

Possible interpretation of opposite Buy Box effects:

- •DMA: Thinner but higher-quality pool + objective criteria where 1P/FBA excels ⇒ Amazon wins Buy Box more often without explicit self-preferencing.
- •DSA: Higher exposure when Amazon is seller-of-record in safety categories ⇒ Amazon cedes Buy Box to vetted 3P offers.

#### After DMA:

- Likelihood that Amazon appears in the buybox is 4.8% higher (base: 0.182)
- Amazon is in the buybox of 2.5% of products where they previously had never been.

#### After DSA:

- Likelihood that Amazon appears in the buybox is 9.8% lower (base: 0.182)

### Preliminary conclusions

- Digital regulation seems to affect Amazon
  - Fewer products per search
  - Fewer sellers per product
  - Buy Box: Amazon ↑ after DMA, ↓ after DSA
- Classic "raising rivals' costs" via compliance frictions (DSA), combined with a shift from search-level advantage (curtailed by DMA) to product-level advantage (Buy Box on objective criteria)
- Next steps: understand mechanisms & heterogeneity, welfare implications

# Thank you!

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# The data challenges of studying Amazon

#### Amazon is truly gigantic

- Pre-select samples (product categories and search terms) for which we have clear priors
- 38 categories across all four countries

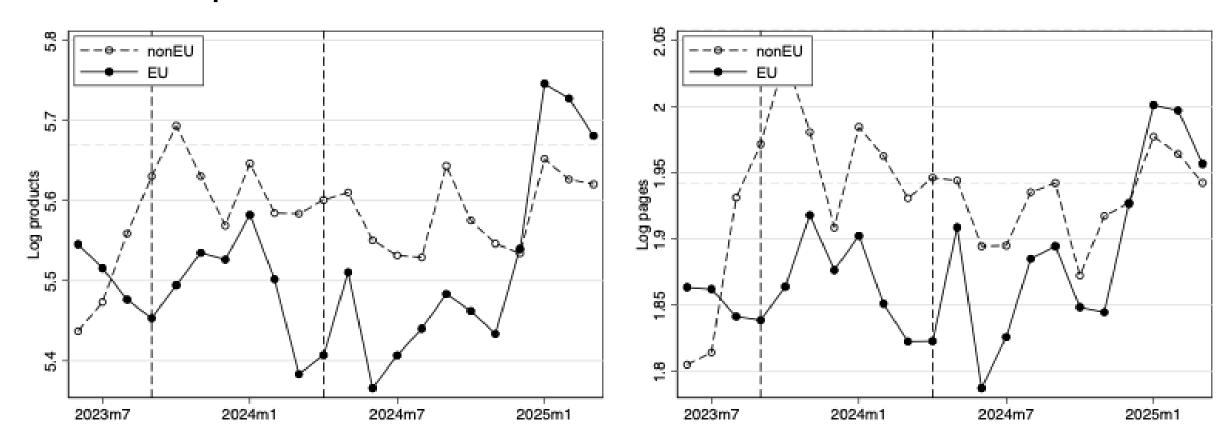
#### Amazon changes a lot

- Put a limit on the number of pages scraped per search to have comparable samples
- Mobile vs. Desktop queries problem -> fixed panel of desktop queries over time

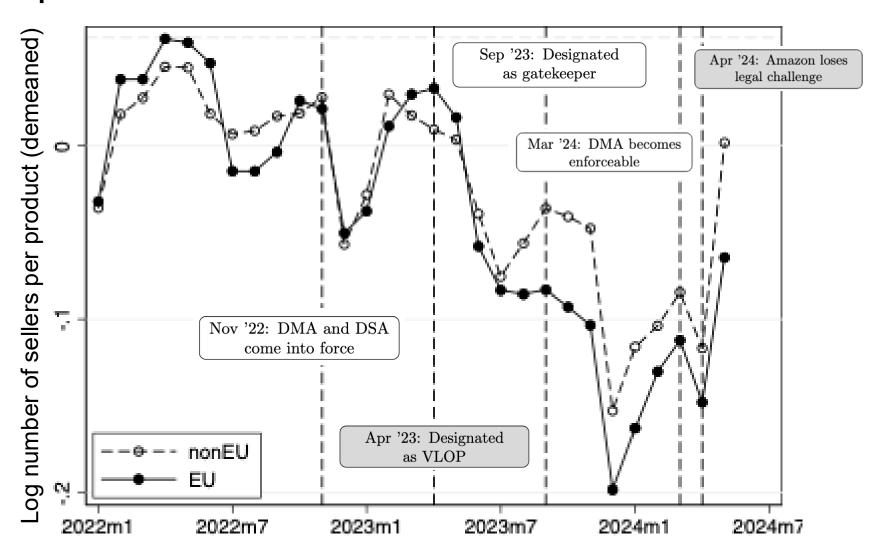
#### Amazon differs across countries

- Select categories and products for which they are comparable
- General robustness: Aggregate Keepa information to identify large trends

# Event plots



# Event plot



## Product categories with safety regulation











**Child Car Seats** 

UNECE Reg. 129 ("i-Size"), UNECE Reg. 44.04

**Car Tires** 

Reg. (EU) 2019/2144, 2020/740, UNECE Reg. 117

KN95 / FFP2 Masks

Reg. (EU) 2016/425 (PPE), EN 149:2001+A1:2009

**High-Visibility Jackets** 

Reg. (EU) 2016/425 (PPE),

EN ISO 20471

Life Jackets

Reg. (EU) 2016/425 (PPE), EN ISO 12402 series Defines crash test, size/weight classes, and installation standards. Mandatory use of approved child seats across EU.

Sets performance & safety requirements (wet grip, noise, rolling resistance) and consumer labelling obligations.

Covers respiratory PPE; defines filtration classes (FFP2 ≈ KN95). CE-marking required for EU market.

Specifies minimum reflective area & visibility classes for workwear and road use.

Defines buoyancy categories (100 N/150 N/275 N) and test methods for leisure and professional use.

## Product categories with strong IP



**Ink Cartridges** 



Patent







**HP / Epson cartridge cases** – tech firms litigated over refill/reuse of printer cartridges.





Category	IP Type	Famous Cases / Examples
Luxury Handbags	Trademark	<b>LVMH v. eBay</b> – counterfeit Louis Vuitton bags online; EU courts confirmed marketplaces can be liable.
Luxury Watches	Trademark	Rolex v. eBay – Rolex successfully pushed for stricter anti-counterfeit measures.
Sports Shoes	Trademark	Adidas v. Fitnessworld – ECJ upheld Adidas' three-stripes against imitation.
Perfume	Trademark	Davidoff v. Gofkid – ECJ ruled against unauthorized repackaging of perfume.
Toys (Brick Toys)	Trademark / Design	Lego v. OHIM – ECJ refused trademark for functional brick shape, but minifigure protected.
Furniture / Fashion	Copyright	Cofemel v. G-Star – ECJ confirmed that original fashion/furniture designs qualify for copyright.