

## VALUE OF DATA AND HARMS



## THREE CASE STUDIES HIGHLIGHT IMPORTANCE OF USER DATA



#### **ONLINE SEARCH**

Detailed user data especially relevant for search quality regarding new search terms.



#### **E-COMMERCE**

Detailed user data especially relevant for recommendations of new products and/or recommendations for new users



#### **MEDIA PLATFORMS**

Detailed user data especially relevant for personalisation and targeted advertising



### **ECONOMIC VALUE CREATION FROM DATA**



#### Number of users increase 'breadth' of user profiles

- Data often created as by-product of usage (clicks, searches)
- Positive but diminishing returns from broader data sets



#### More data on individual users increases 'depth' of user profiles

- More data on user behaviour gradually improves quality of algorithmic learning
- Reinforces benefits of broader data sets



Economic value also influenced by timeliness, accuracy and granularity of data



#### Complementary inputs needed to derive economic value from data

computing resources, skilled labour, algorithms

### cerre

#### **Individual users**

	U1	U2	U3	U4	U5	U6		
ID	id <sub>1</sub>	id <sub>2</sub>	id <sub>3</sub>	?	id <sub>5</sub>	?		
Name	-	Jane Doe	-	-	John Stiles	-		
01	-	X <sub>12</sub>	-	X <sub>14</sub>	-	-		
02	X <sub>21</sub>	-	-		4			
О3	-	X <sub>32</sub>	-		Sparsit	y		
04	X <sub>14</sub>	-	-		<b>T</b>	X <sub>46</sub>	•••	

Observations, Attributes, Products,

Traceability

Identifiability

Granularity

*Depth* of data

Data value dimensions Breadth of data



## FEEDBACK LOOPS FROM DATA DATA-DRIVEN NETWORK EFFECTS



Data-driven **network effects** facilitate market tipping Data advantage can spill-over to related markets and **induce tipping** 



Ancillary data services even allow for **data collection in other markets** without need for competition in these
markets



Data-driven network effects create **entry barriers** that lead to **reduced innovation** and 'kill zones' for venture capital



Inherent efficiencies in data-driven network effects which can benefit consumers



#### **POLICY OBJECTIVES**

- Short-run contestability of incumbents through data sharing is unrealistic
- Rather long-run objective of niche-entry-andgrowth
- Especially deep and broad behavioural user data bottleneck resource
- Data sharing allows to maintain efficiency of incumbent, while increasing efficiency and ability to innovate of entrants
- · Goal: reduce concentration of collection of user data

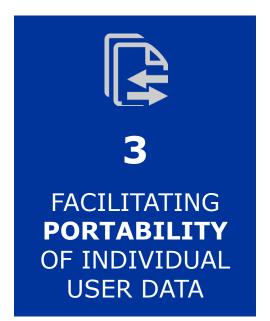
### POSSIBLE DATA ACCESS REMEDIES



#### THREE TYPES OF ACCESS REMEDIES











#### 1. LIMITING THE USE OF DATA

- Data silos / data walls
- Shorter data retention periods
- Prohibit buying into defaults
- Line of business restrictions
  - Vertical separation
  - Ancillary data services (authentication services, payment services, web tracking services)
- Privacy Enhancing Technologies





## 1. LIMITING THE USE OF DATA CONCLUSIONS

- Limiting the efficiency of the incumbent, rather than enhancing the efficiency of entrants
- Also sceptical about effectiveness/usefulness of
  - Data siloing
  - Shorter data retention periods
  - Prohibit buying into defaults
  - Vertical separation
- However, worth exploring further:
  - Line of business restrictions for ancillary data services
  - Privacy Enhancing Technologies (case-by-case)





# 2. BULK SHARING OF AGGREGATED USER DATA PRINCIPLES

- Only raw user data (observed and volunteered) may have to be shared
- Only data that was created as a by-product of consumers' usage (not volunteered data at the core of the service)
- Secure and sufficiently anonymised
- Real-time and continuous sharing through APIs





# 2. BULK SHARING OF AGGREGATED USER DATA TRADE-OFFS

#### PROTECTING LEGITIMATE BUSINESS INCENTIVES

VS.

PROMOTING COMPETITION

Data as a by-product vs. data as a main product Existence of viable commercial data offers

**USERS' PRIVACY** 

VS.

USEFULNESS OF DATA SET OF ALGORITHMIC LEARNING

Anonymisation
Data trusts and data sandboxing
Unlawfulness of de-anonymisation





# 2. BULK SHARING OF AGGREGATED USER DATA EXAMPLE: SEARCH LOGS

- Publicly shared data with stronger anonymisation
- Individually shared data
  - More detailed data set compiled case-by-case
  - Requires vetting of data recipient
  - Subject to liability and other safeguards





# 2. BULK SHARING OF AGGREGATED USER DATA EXAMPLE: SEARCH LOGS

DATA ON THE QUERY	DATA ON THE SEARCH RESULTS PAGE (SERP)	DATA ON THE USER		
Keywords (e.g., raw search string, synthetic search string)	Clicked URLs (first clicked result, last clicked result, all clicked results)	Unique identifier		
Timestamp (e.g., week, day, hour, seconds)	Zero-Click search (yes/no)	Device metadata (e.g., mobile/ desktop, browser metadata)		
Connected queries in the same session	Results ranking (top 3, top 5, top 10)	Location data (IP-address, GPS)		
	Layout of the SERP (sponsored results, one-boxes)	Other available user attributes (e.g., age and gender from account data)		





# 3. PORTABILITY OF INDIVIDUAL USER DATA PRINCIPLES

- Only raw user data (observed and volunteered)
  - Same scope as Art. 20 GDPR
- Requires consumer consent on fine-granular level
  - Disallow extortion of consent through commercial incentives or disincentives
- Real-time, continuous portability using APIs
- Open and secure standards with high reliability and performance

### **CONCLUSIONS**



#### **CONCLUSIONS**

### Especially **observed behavioural user data** important input for algorithmic learning

Data-driven network effects create significant entry barriers

Policy focus should be on niche-entry-and-growth



#### **CONCLUSIONS**

### **Data sharing preferred** over limiting data use and collection

#### 2 modes of mandated data sharing recommended

'broad' user data in bulk \ 'deep' user data (individual consent) Combination sharing (deep & broad) user data feasible

Careful **case-by-case analysis** required before mandating bulk data sharing

