Towards a shared European Statistical System infrastructure for collaborative confidential computing

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INEXDA Working Group on Statistical Disclosure Control
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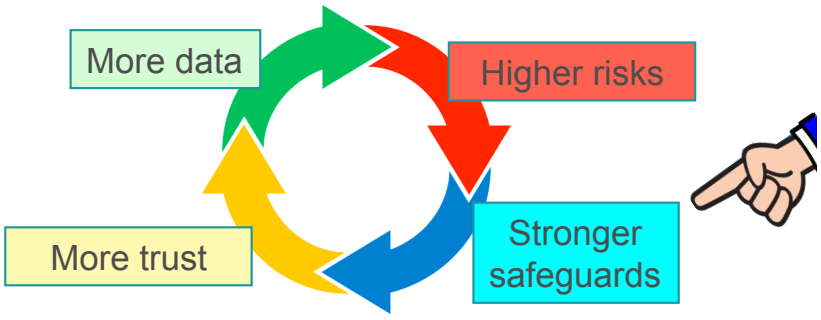
Why SPC in Official Statistics?

- Several trends Official Statistics innovation concur to increase the appetite for **cross-organisational data processing** in the context of
  - Data held by **NSIs in different countries** concerning cross-border phenomena (e.g., int'l trade, migration, …)
  - Statistics based on **administrative data held by other public bodies**
  - New statistics based on **privately held data**, based on very detailed and pervasive data, and requiring integration across different providers (often competitors in the same business sector) and with data held by NSI
- Increasing awareness by the general public of **personal data** protection → higher efforts to gain public **acceptance**
- Legal **compliance**



I-PETs and O-PETs

- **Input Privacy (Enhancing) Technologies** (I-PET for short) allow (i) computing the **exact predefined output y** and delivering it to the predefined output party/ies while (ii) preventing anybody from learning anything about the input data x other than what can be inferred directly from y (including of course “seeing" the input data themselves) … all the above is of course valid under certain conditions (→ scenario assumptions, attack model)
  - HE, SMPC (secret sharing), TEE…
- **Output Privacy (Enhancing) Technologies** (O-PET for short) aim at producing a **quasi-result $y* \approx y$** that fulfils two conflicting conditions, namely (i) it is sufficiently close to the exact result y to be still useful for the intended purpose, but at the same time (ii) it does not allow to infer back individual identities or characteristics of the data subjects represented in the input data x.
  - DP, SD, FL, …

I-PETs and O-PETs

- **Input Privacy (Enhancing) Technologies** (I-
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  - HE, SMPC (secret sharing), TEE…

a.k.a. Secure Private Computing (SPC)

In scope of this talk

- **Output Privacy (Enhancing) Technologies** (O-PET for sho
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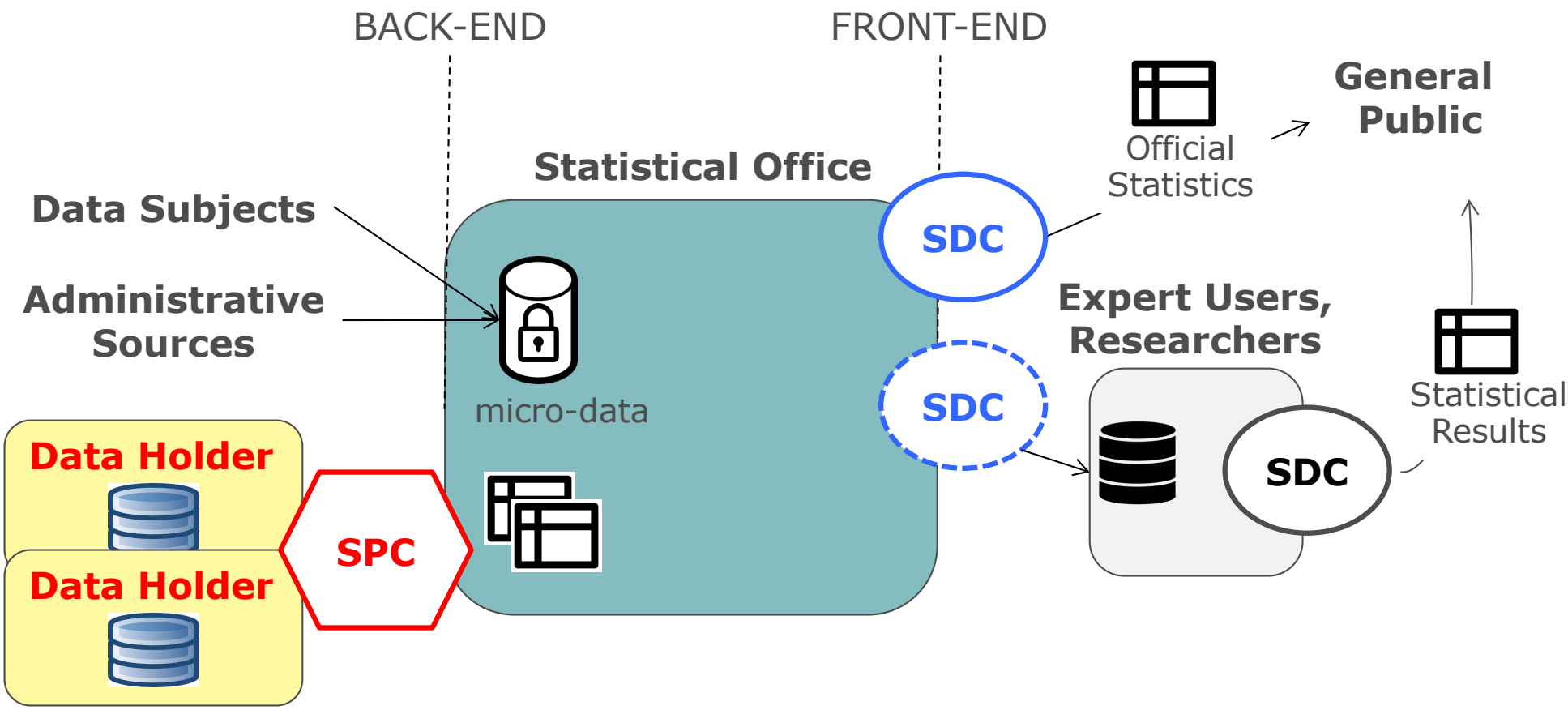
  - DP, SD, FL, …

NOT in scope of this talk

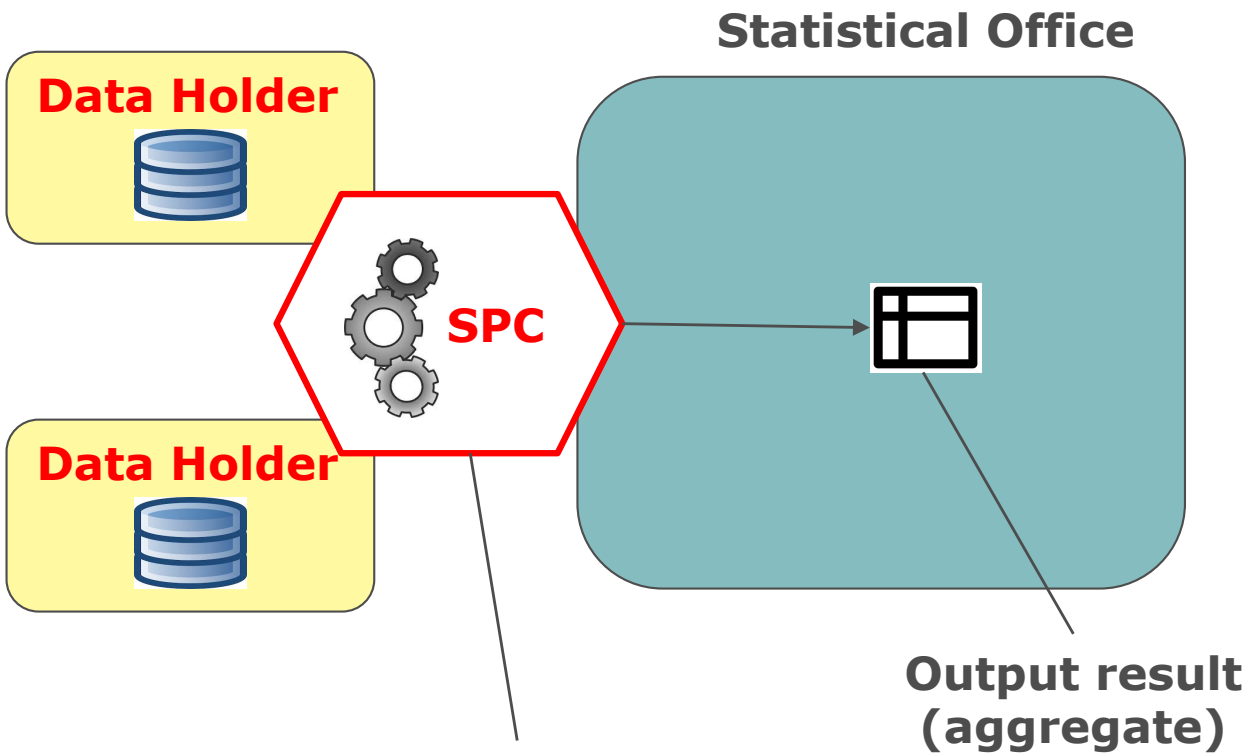
SPC on back-end, SDC on front-end



SPC: Secure Private Computing → I-PET

SDC: Statistical Disclosure Control → O-PET

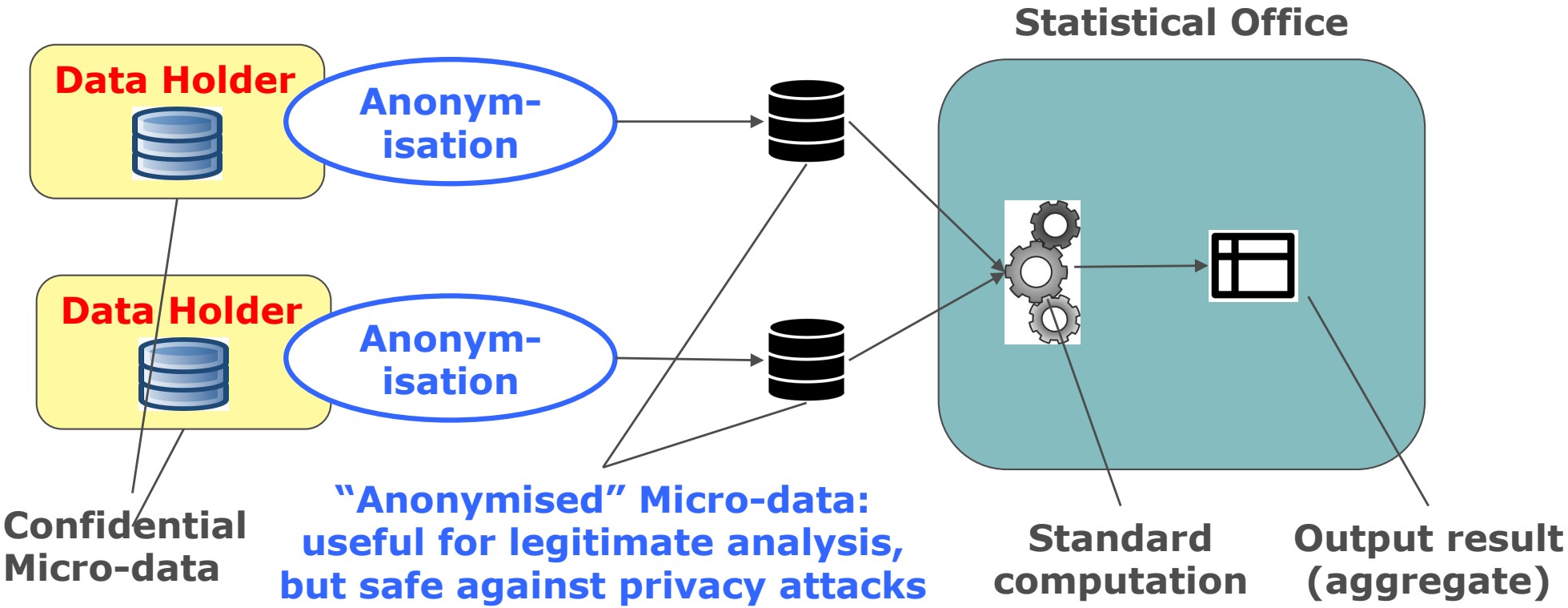
Using I-PET for the Input Privacy



Protected computation:
It reveals only the output to of a pre-defined function to the pre-defined recipient

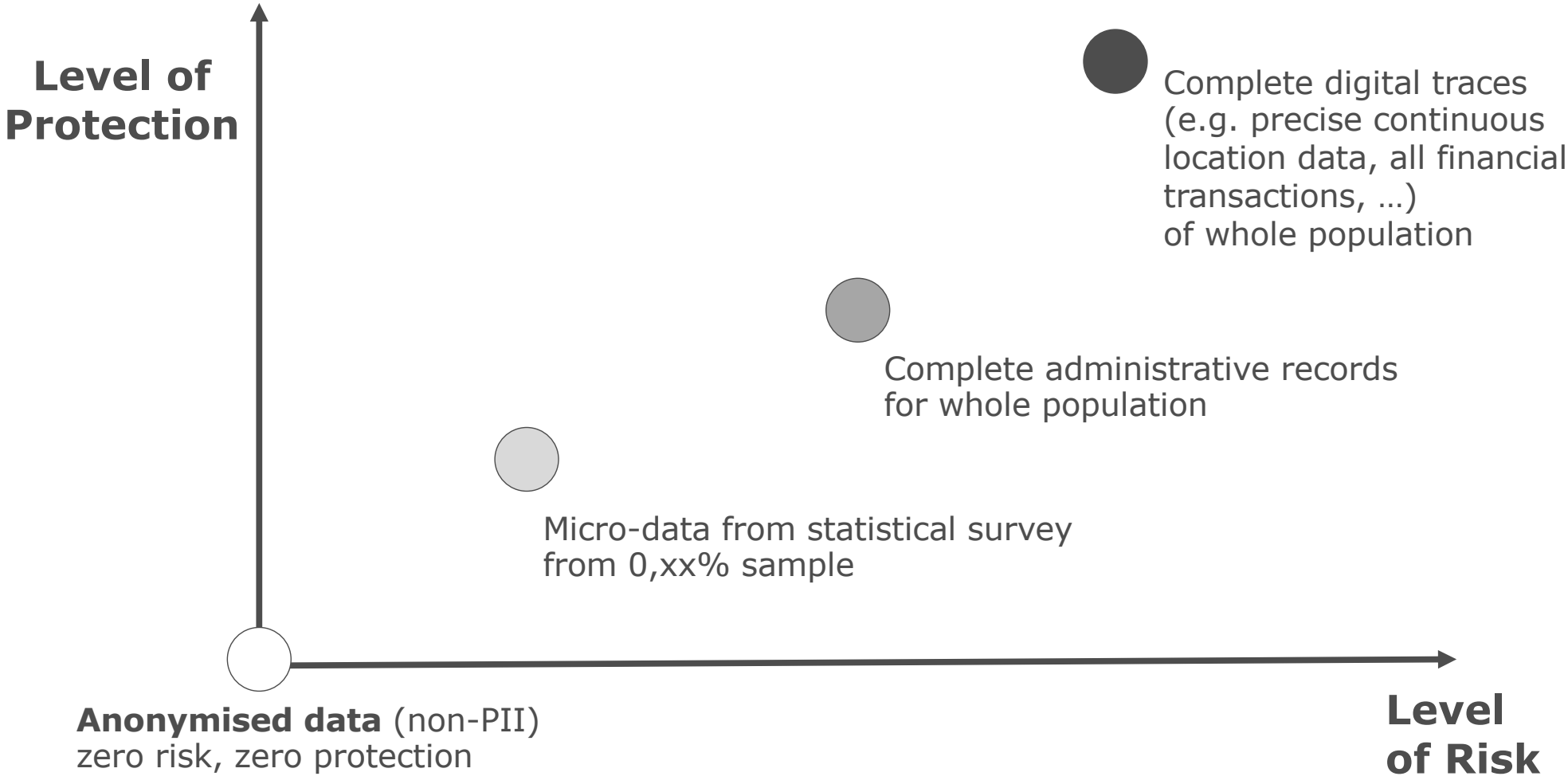
Our approach

Can we use O-PET to solve the Input Privacy problem?



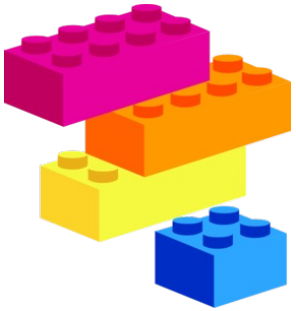
NOT our approach
(is that feasibile at all??)

Proportionality – a key GDPR concept

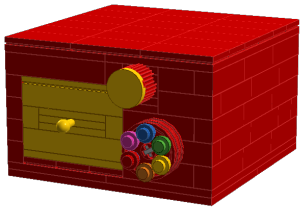


PII Personal Identifiable Information

SPC system



- SPC technologies are the **bricks, not a magic stick –** one needs to engineer a whole system solution (hardware, software and … *humanware*)
- SPC ***enforces technologically*** governance policies for **data & code**
  - stipulating *ex-ante* what output information is computed on the data, with what code and who will see it
  - adopting technological solutions that prevent any other entity seeing any other information (including the input data themselves) if certain conditions are met (attack model, trust model) – and verify *ex-post*



ORGANISATION

DATA/CODE POLICIES, PROCESS, AGREEMENTS

RULES & ROLES FOR PEOPLE

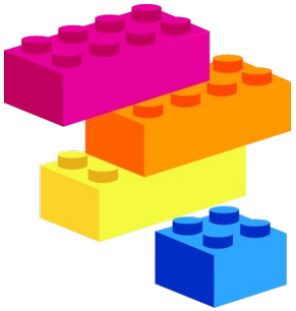
TECHNOLOGY

HW/SW, **PROTOCOLS**, CRYPTOGRAPHIC PRIMITIVES …

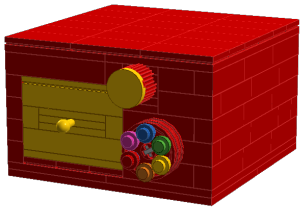
RULES & ROLES FOR MACHINES

SPC: Secure Private Computing

SPC system



- A SPC solution is a *system of safeguards* comprising
  - **Technological** components (e.g., SMPC + TEE + …)
  - **Organisational** components: policies, processes, agreements…



ORGANISAT

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HW/SW, **PROTOCOLS**,
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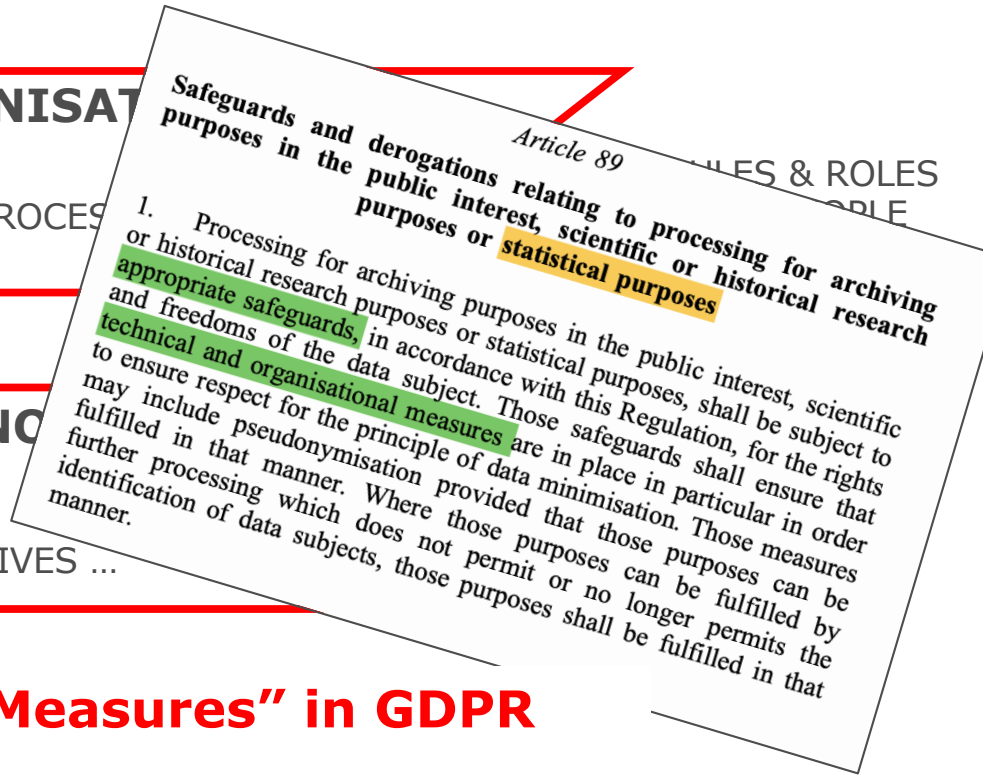


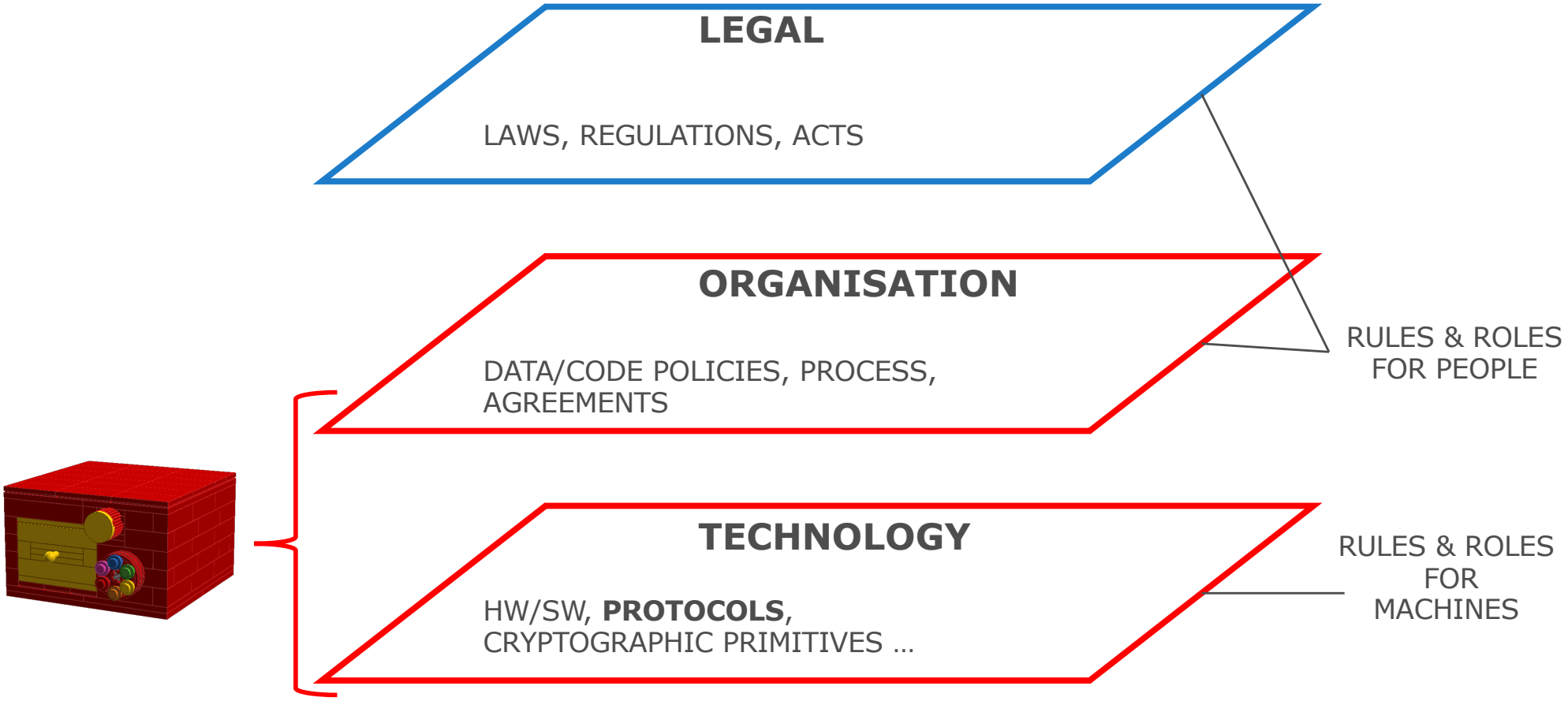
Article 89

Safeguards and derogations relating to processing for archiving purposes in the public interest, scientific or historical research purposes or statistical purposes

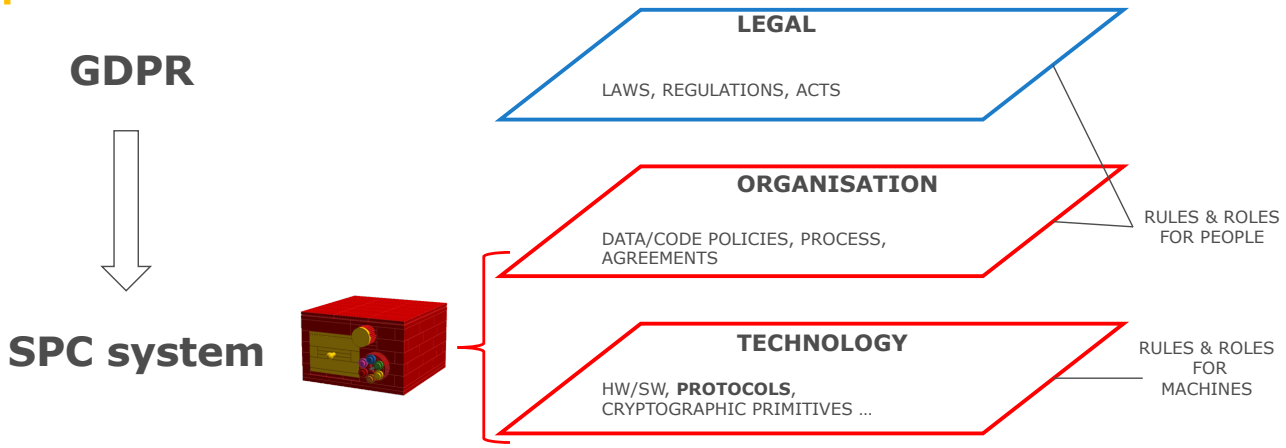
1. Processing for archiving purposes in the public interest, scientific or historical research purposes or statistical purposes, shall be subject to appropriate safeguards, in accordance with this Regulation, for the rights and freedoms of the data subject. Those safeguards shall ensure that technical and organisational measures are in place in particular in order to ensure respect for the principle of data minimisation. Those measures may include pseudonymisation provided that those purposes can be fulfilled by further processing which does not permit or no longer permits the identification of data subjects, those purposes shall be fulfilled in that manner.

"Technical and Organisational Measures" in GDPR

3 normative layers

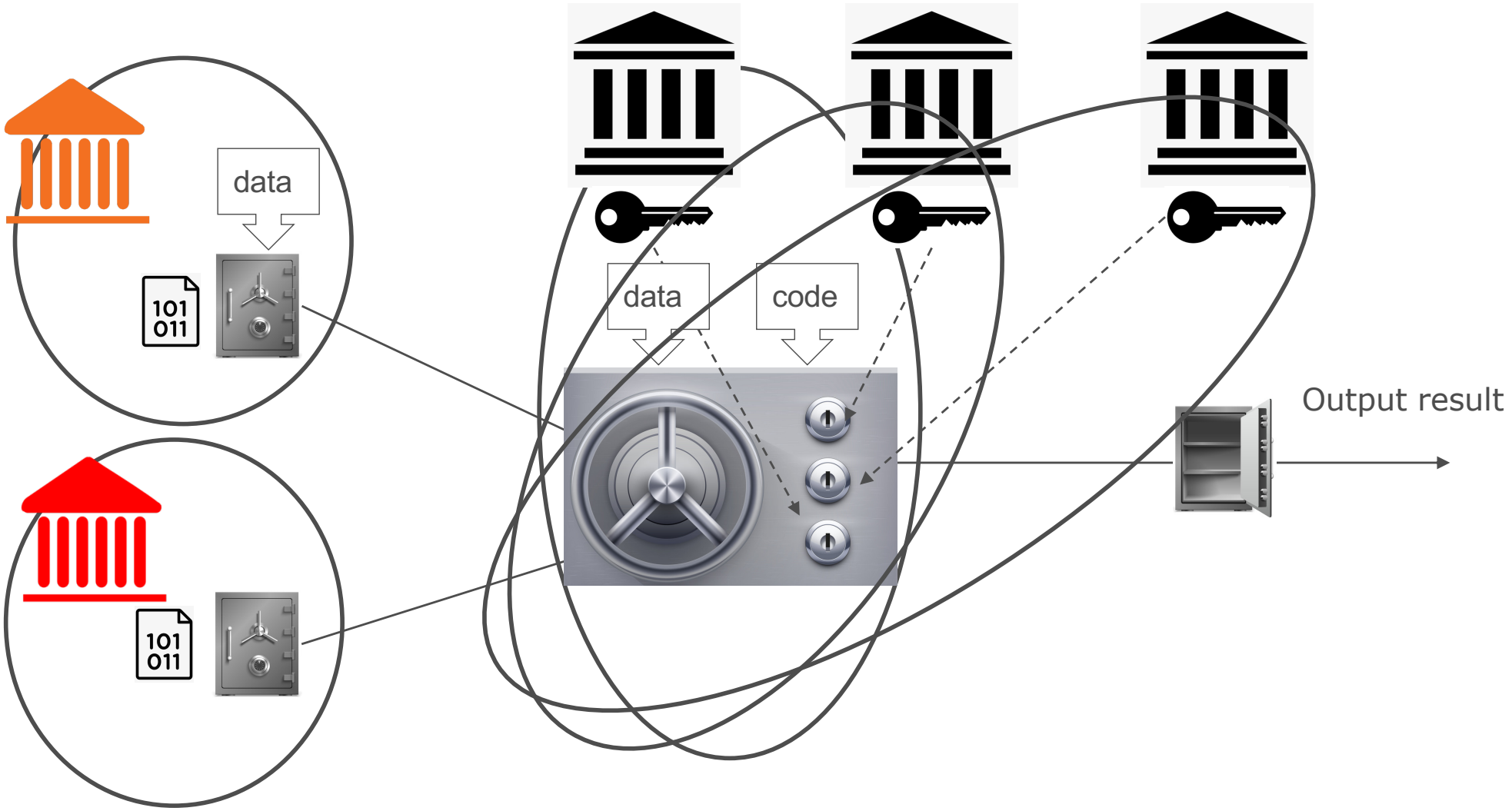


GDPR principles as design requirements (top-down approach)

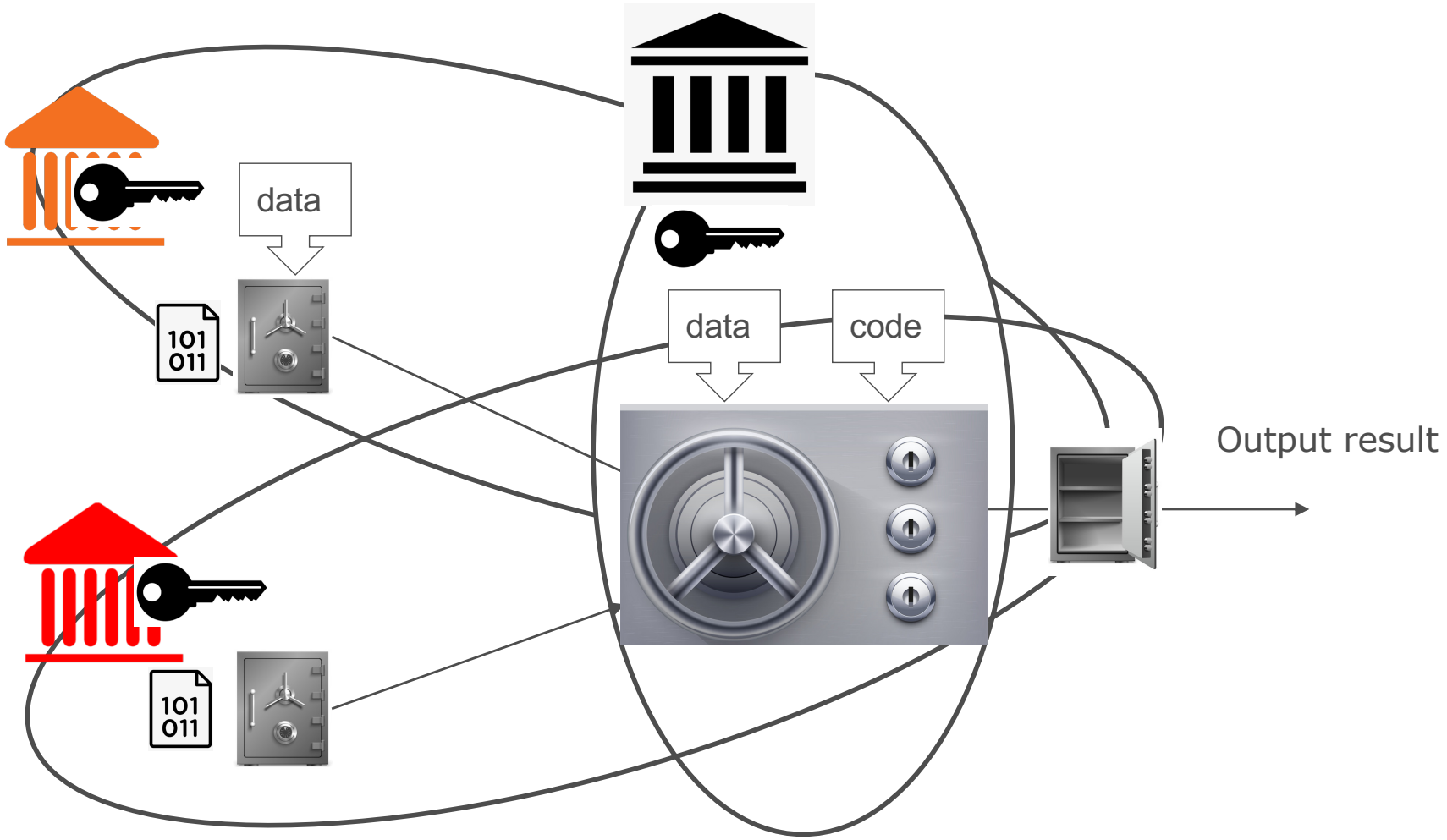


GDPR principle - requirement	System specifications at organisational level	System specifications at technical level
Lawfulness, fairness and transparency	…	…
Purpose limitation	…	…
Data minimisation	…	…
Accuracy	…	…
Storage limitation	…	…
Integrity and confidentiality	…	…
Accountability	…	…

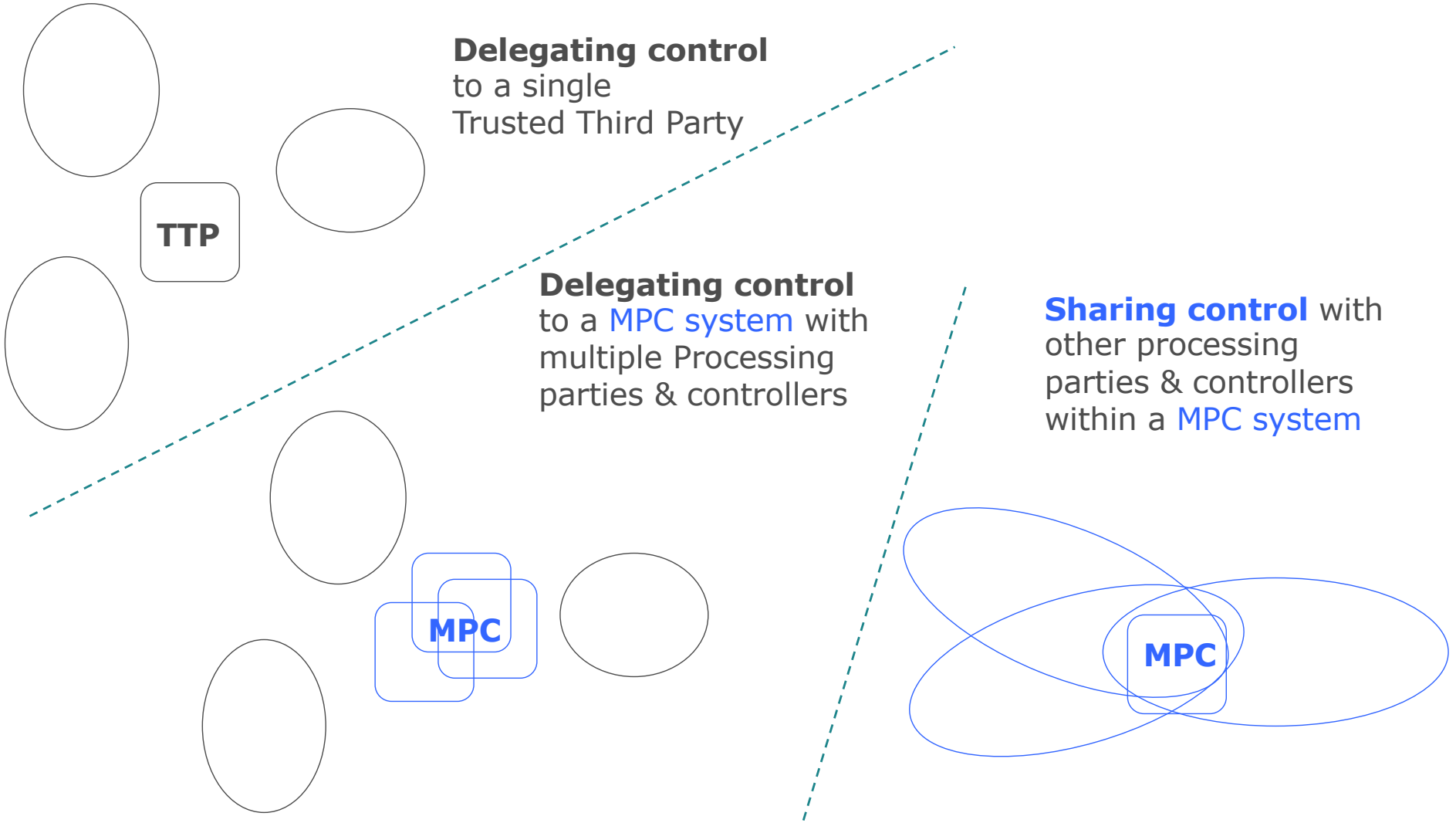
Multi-Party computation with external Processing Parties (multi-key)



Multi-Party computation with data holders acting also as Processing Parties



From delegation to sharing (of processing control)



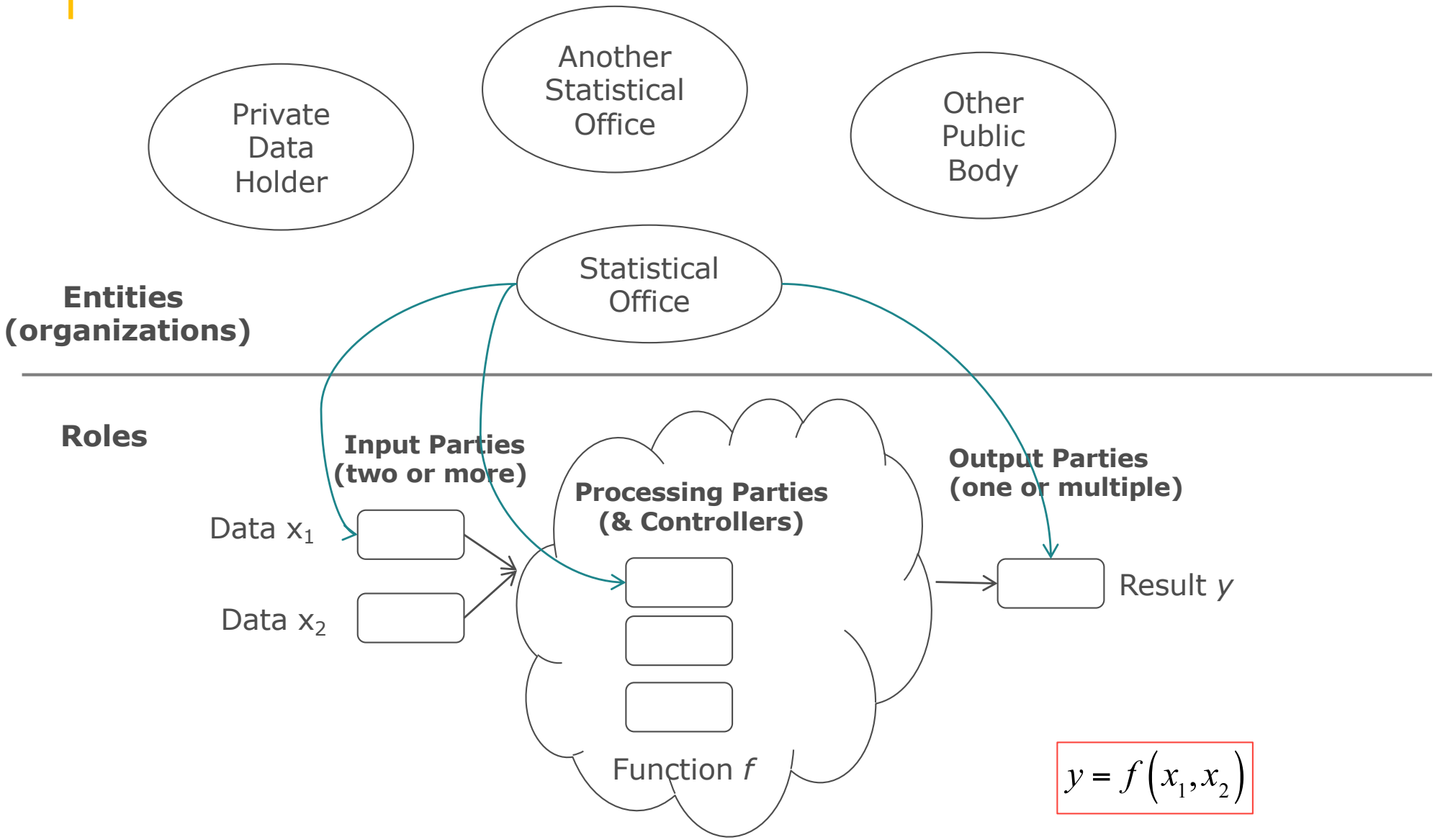
Delegating control
to a single
Trusted Third Party

Delegating control
to a MPC system with
multiple Processing
parties & controllers

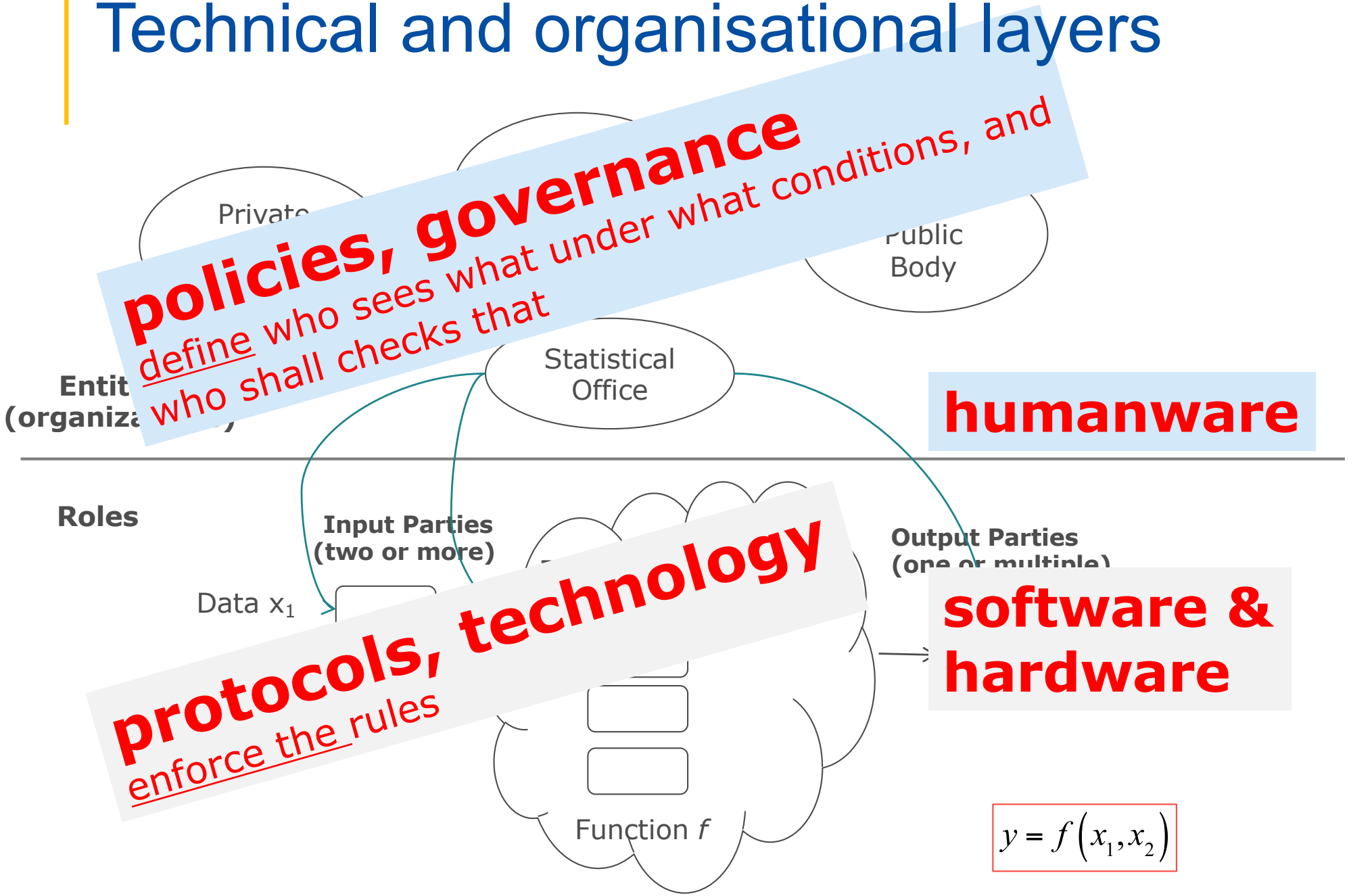
Sharing control with
other processing
parties & controllers
within a MPC system

Explanation: ovals represent Input Parties and Output Parties.
Rectangles represent processing parties & controllers

Technical and organisational layers



Technical and organisational layers

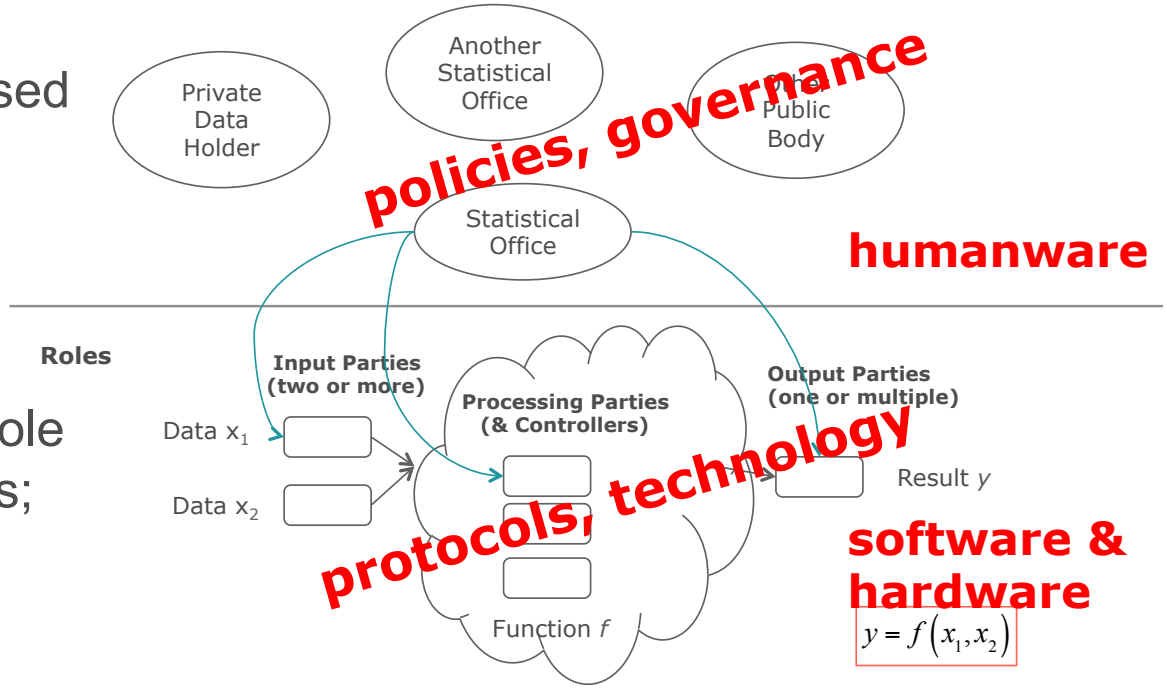


"…technical and organisational measures…"

Trust model

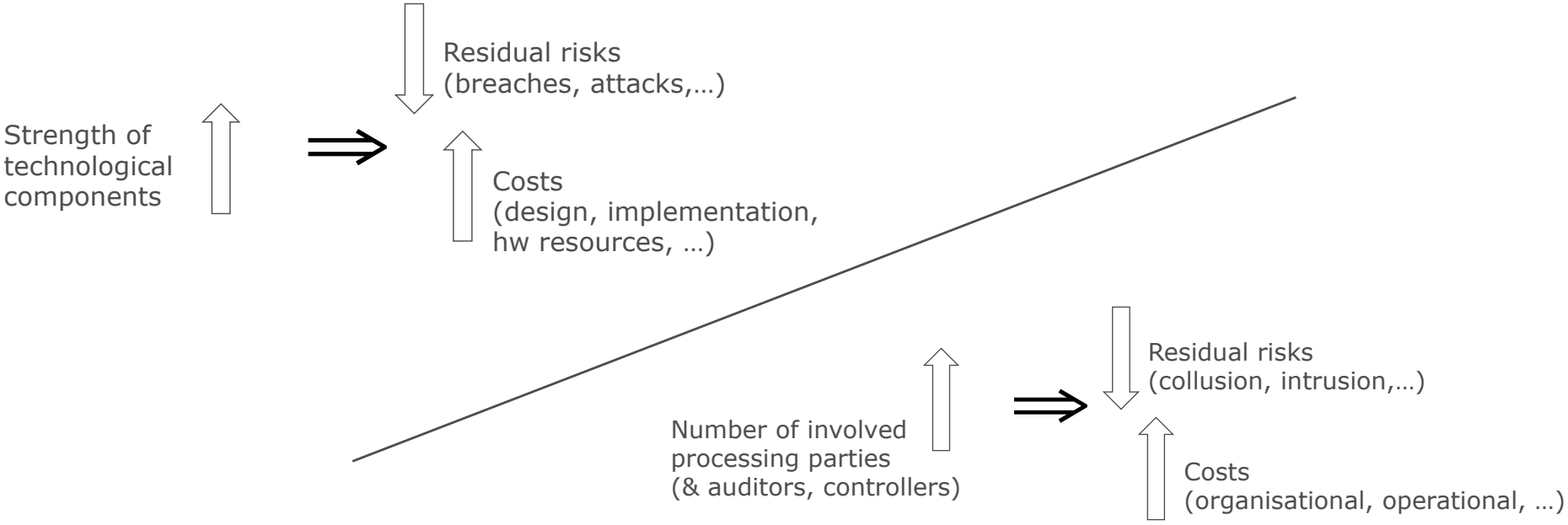
- The essential role of the is to enforce technologically the governance/policies (for data & code) defined among entities
- Truly 'Multi-Party' → avoid single-point-of-trust → the set of processing parties to be *trusted collectively, not individually*
- If you don't trust the other processing parties, be a processing party yourself!

- The overall strength of MPC-based solution depends *jointly* on
- (i) robustness of policies/governance scheme;
- (ii) choice of entities taking the role of processig parties & controllers;
- (iii) strength of technology implementation



What about the costs?

- Designing and building a **robust SPC system** is *costly*
  - Highly specialised skills: cryptography, HW/SW security, …
  - ~~€€€~~ for HW/SW infrastructure building, deploying, maintenance
  - Several **cost-vs.risk trade-offs**

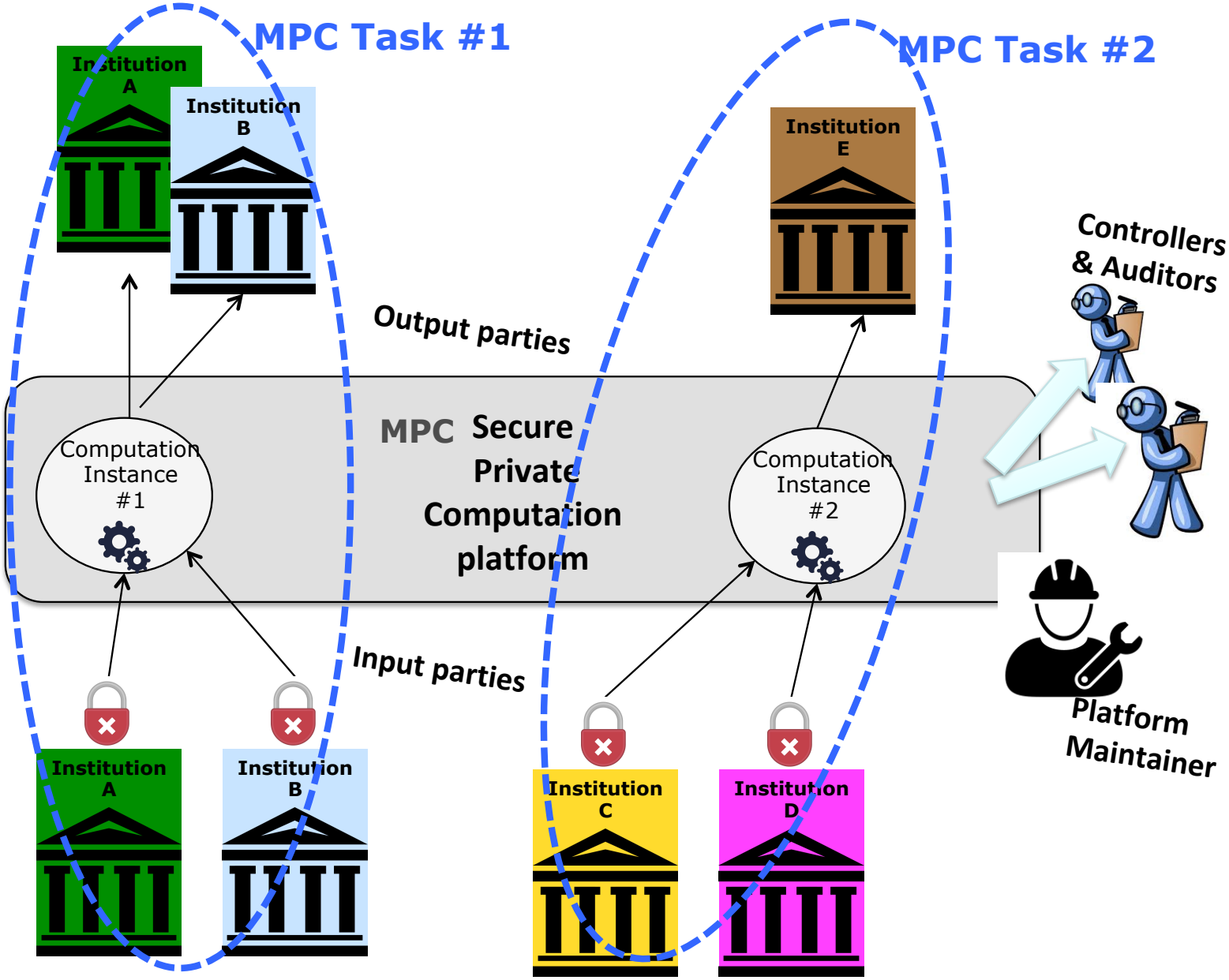


Lowering the risks *and* the costs

- Q. How to make the strongest possible Multi-Party Secure Private Computing (MPSPC) solution affordable for adopters?
  - Lowest risk at low cost
- Saving on costs → lower robustness → increase the risk
  - This contradicts the primary motivation for SPC in the first place, i.e., “lowering the risk”

- Alternative: **shared solution**
  - Joining forces, pooling resources, building once, use many times – by multiple organisations, for multiple use-cases
  - MPSPC-as-a-service (**MPSPCaaS**)

Multi-Party SPC-as-a-service (MPSPCaaS)



Multi-Party SPC-as-a-service (MPSPCaaS)

- Built and operated by a consortium/network/**partnership** *of* public institutions *for* public institutions and their private partners
  - E.g. European Statistical System (ESS)

> The ESS is the **partnership** between the EU statistical authority, which is the Commission (Eurostat), the 'National Statistical Institutes' (NSIs), and 'Other National Authorities' (ONAs) in each EU country. These are responsible for the development, production, and dissemination of European statistics. This partnership also includes the European Free Trade Association (EFTA) countries. For

Source: https://ec.europa.eu/eurostat/web/european-statistical-system

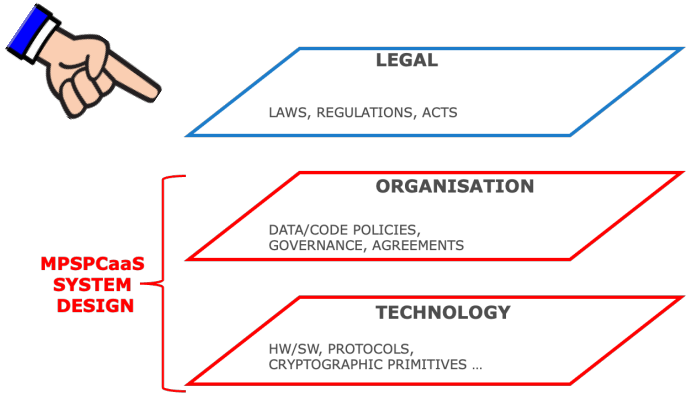
  - PET as *Partnership* Enhancing Technology *(*)*

(*) Credit to Andrew Trask for inventing the term. Source: The Coming Age of Collaborative Computing https://medium.com/lunar-ventures/the-age-of-collaborative-computing-e73374b7aedc

MPSPCaaS concept

- First proposed by Eurostat in the context of UNECE HLG-MOS project on Input Privacy Preservation (IPP, 2021-2022)
  - (2021) Discussed internally to IPP project team
  - (2022) Open Technical Consultation organised within the IPP project
  - Presentations and exhange of views with data protection and privacy experts (ENISA workshop, MPC alliance, …)
- 2023 Eurostat Call for Tender
  - *Specification, feasibility analysis and prototype demonstration of a multi-party secure private computing system for processing confidential sets of micro-data across organisations in support of statistical innovation (TSS-PET)*
  - Published on 7/4/2023 with submission deadline 31/7/2023 (now closed)
    - https://etendering.ted.europa.eu/cft/cft-display.html?cftId=12503
  - Currently in evaluation phase.
  - Planned duration 2 years

PET and European legislation – not just GDPR

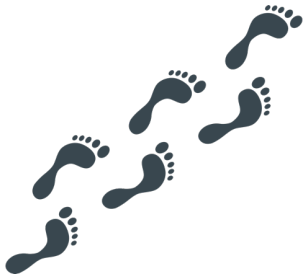


- Data Governance Act mentions 'secure processing environments'

- Jan'23 adoption by European Commission (EC) of proposal for new regulation on European Statistics on Population and Housing (ESOP) making explicit reference in Recital (30), Art. 13 and Art. 14. (link)
- EDPS opinion on ESOP published in 16/3/2023 (link)

- July'23 adoption by EC of proposal for revising Regulation 223/2009 on European statistics (link).
- EDPS opinion published in Sept 2023 (link)

(30) When data sharing entails processing of personal data according to Regulation (EU) 2016/679 of the European Parliament and of the Council[37] or Regulation (EU) 2018/1725, the principles of purpose limitation, data minimisation, storage limitation and integrity and confidentiality should be fully applied. In particular, data sharing mechanisms based on privacy enhancing technologies that are specifically designed to implement these principles should be preferred over direct data transmission.



Article 14
Pilot and feasibility studies

1. The Commission (Eurostat) shall, where necessary and appropriate for the purposes of this Regulation, launch pilot and feasibility studies that aim at:
   (a) assessing the availability of data sources and their quality, including of publicly and privately held data in Member States and at Union level;
   (b) developing and assessing the feasibility of implementing new topics, detailed topics, statistical units, variables and their breakdowns;
   (c) developing new methodologies and statistical techniques to reinforce quality;
   (d) reducing asymmetries of migration flows;
   (e) testing and assessing the fitness of relevant privacy enhancing technologies for secure data sharing within the ESS in accordance with Article 13(4);
2. Member States may participate in those studies but shall, together with the Commission (Eurostat), ensure the representativeness of those studies at Union level.
3. The results of those studies shall be evaluated by the Commission (Eurostat) in cooperation with Member States. The Commission (Eurostat) shall prepare in cooperation with the Member States reports on the findings of those studies.

Article 13
Data sharing

1. Data shall be shared between the competent national authorities of different Member States, and between these competent national authorities and the Commission (Eurostat), exclusively for the purpose of developing and producing European statistics governed by this Regulation and of improving their quality.
2. In the interest of secure data sharing within the ESS, all necessary safeguards with regard to the physical and logical protection of data shall be taken. The Commission (Eurostat) shall set up a secure infrastructure to facilitate data sharing referred to in paragraph 1. Competent national authorities for statistics under this Regulation may use this secure data sharing infrastructure for the purpose specified in paragraph 1.
3. When the data concerned are confidential data within the meaning of Article 3, point 7, of Regulation (EC) No 223/2009 or personal data according to Regulations (EU) 2016/679 and (EU) 2018/1725, the sharing of such data shall be allowed and may take place on a voluntary basis provided it is:
   (a) based on a request justifying the necessity to share the data in each individual case, in particular with regard to the quality issues to be specifically addressed;
   (b) based preferably on privacy enhancing technologies that are specifically designed to implement the principles of Regulations (EU) 2016/679 and (EU) 2018/1725, with particular regard to purpose limitation, data minimisation, storage limitation, integrity and confidentiality;
   (c) without prejudice to Chapter V of Regulation (EC) No 223/2009.
4. The Commission (Eurostat) and the Member States shall test and assess by means of pilot studies the fitness of relevant privacy enhancing technologies for data sharing.
5. Where the pilot studies under paragraph 4 of this Article identify effective and secure data sharing solutions for the purposes referred to in paragraph 1, the Commission may adopt implementing acts laying down technical specifications for the data sharing and measures for the confidentiality and security of information. These implementing acts shall be adopted in accordance with the examination procedure referred to in Article 18(2).

Official Statistics as a favourable incubator for MPSPCaaS

- A "**partnership**" of multiple organisations with common mandates and a culture of coordination, cooperation and sharing is already in place – it's the ESS (!)
- **Legal enablers** for Official Statistics enshrined in GDPR - Art 89(1) statistics purposes non-incompatible with primary purpose
- **Methodological transparency**: methods are not secret! Methods are (should be) publicly available, anyway not subject to IPR
- For many use-cases, relatively **simple statistical methods** suffice (e.g., set intersection, low-dimensional regression) which helps scalability
- …

IPR : Intellectual Property Rights

Take home messages

- In our view, well-designed SPC solutions represent today the strongest possible way to embody the GDPR principles (data minimisation, purpose limitation, storage limitation, integrity and confidentiality, etc.)
  - Embracing GDPR principles as design requirements
- Continuous dialogue (co-design) with **technology specialists** and **data protection legal experts** is needed to design robust (technically and legaly)and usable solutions
  - Consultation with Data Protection Authorities

- Work is in progress: Eurostat and the ESS advancing step-by-step, from initial **concept** through **specification** towards future **deployment** of shared PET infrastructure for the ESS, based on the MPSPCaaS concept
- This work by Eurostat in the ESS may serve as a lighthouse and inspiration for other public sectors (and maybe also private sector?) as to how data protection and data usage can be **reconciled**, rather than confronted or compromised.

Thank you for your attention

More about the work done at Eurostat on Privacy Enhancing Technologies for Official Statistics (PET4OS):

https://ec.europa.eu/eurostat/cros/content/privacy-enhancing-technologies-official-statistics-pet4os_en

(with links to all references in the presentation)