

A photograph of a modern, multi-story white building with glass balconies and a large, striped glass roof. The building is brightly lit by sunlight, creating strong shadows. The text "IT UNIVERSITY OF COPENHAGEN" is overlaid in the top right corner.

IT UNIVERSITY OF COPENHAGEN

Extend, Not Just Accelerate!

DAMON'21 Fresh Thinking Talk

Zsolt István

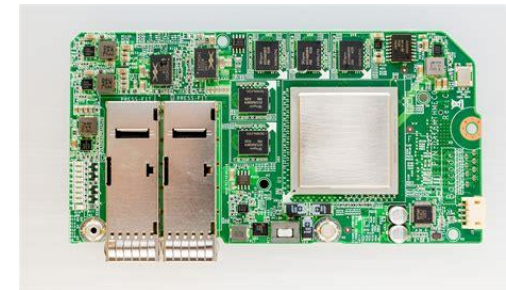
545 million years ago. There was an
Explosion of Life!

Hardware



Specialized Hardware is Everywhere

- Accelerators (GPGPUs, TPUs, FPGAs, ...)
- Fast and Smart Networking (NICs, Switches, ...)
- Smart Drives, ZNS, ...
- Motherboards with spec. chips
- ...



Use to Improve Databases

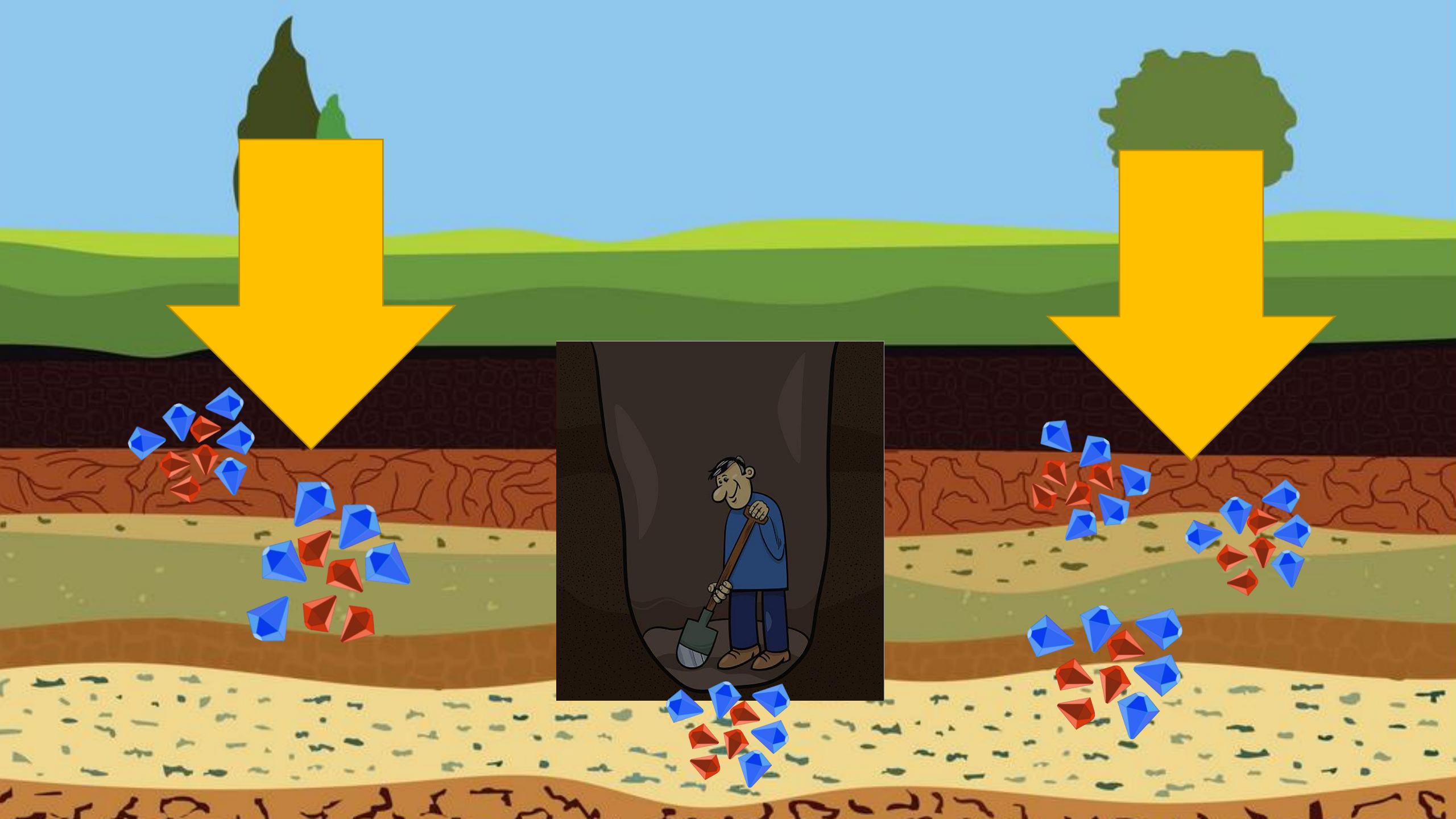


NITRO CARDS

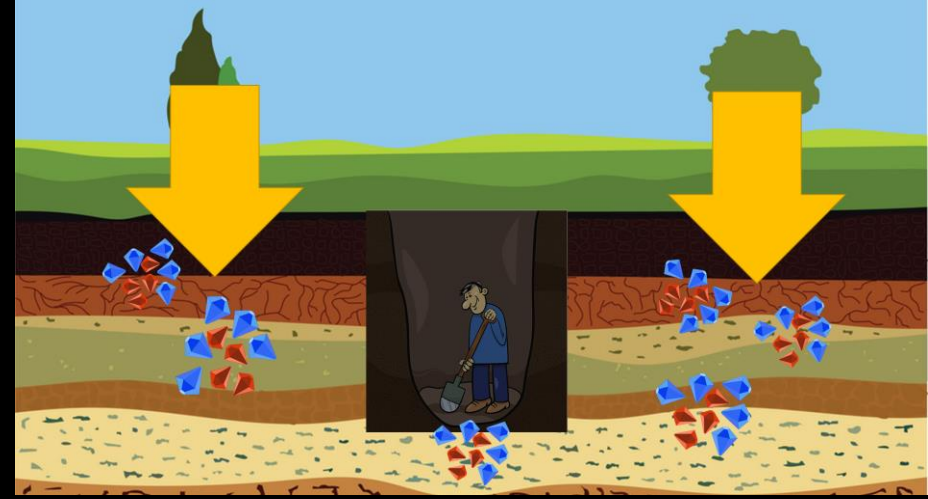


SQL Acceleration





Extend, Not Just Accelerate!



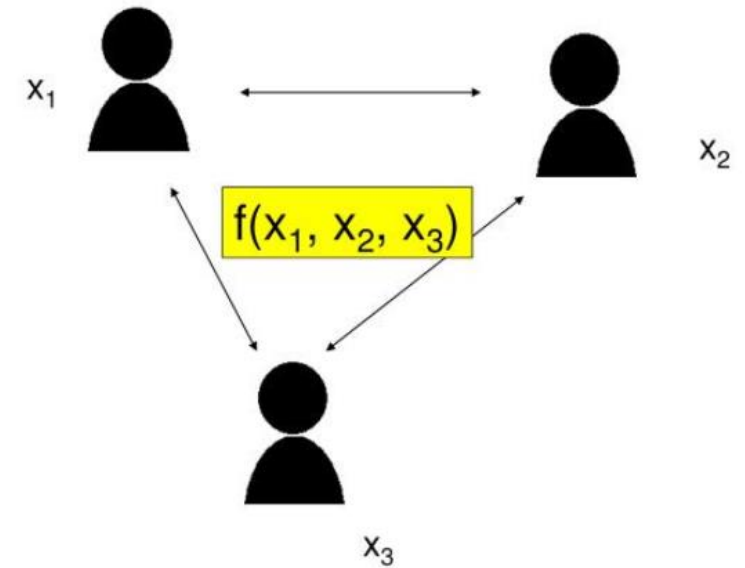
- Add new features or guarantees to DB
- Utilize modern hardware to hide the cost, or to make practical
- This talk: A sample of exciting areas to look at as Database/Systems person
(Non-exhaustive list of related work)



Privacy Preserving Operators

Secure Multiparty Computation (MPC)

- Secure Multiparty Computation
 - Participants compute a shared function without disclosing their part of the data
- Many database applications: Anything that would need shared data!
 - E.g.: statistics on sicknesses based on patients with records at different hospitals



Challenges in MPC

- Orders of magnitude slower than plaintext processing
 - Computation expressed as “circuit”
 - “Gates” evaluated with cryptographic functions
- Most optimizations today are at the algorithm level, next step will be HW!
[Volgushev et al. Conclave: secure multi-party computation on big data. EuroSys'19]
- There are more and more libraries to work on:

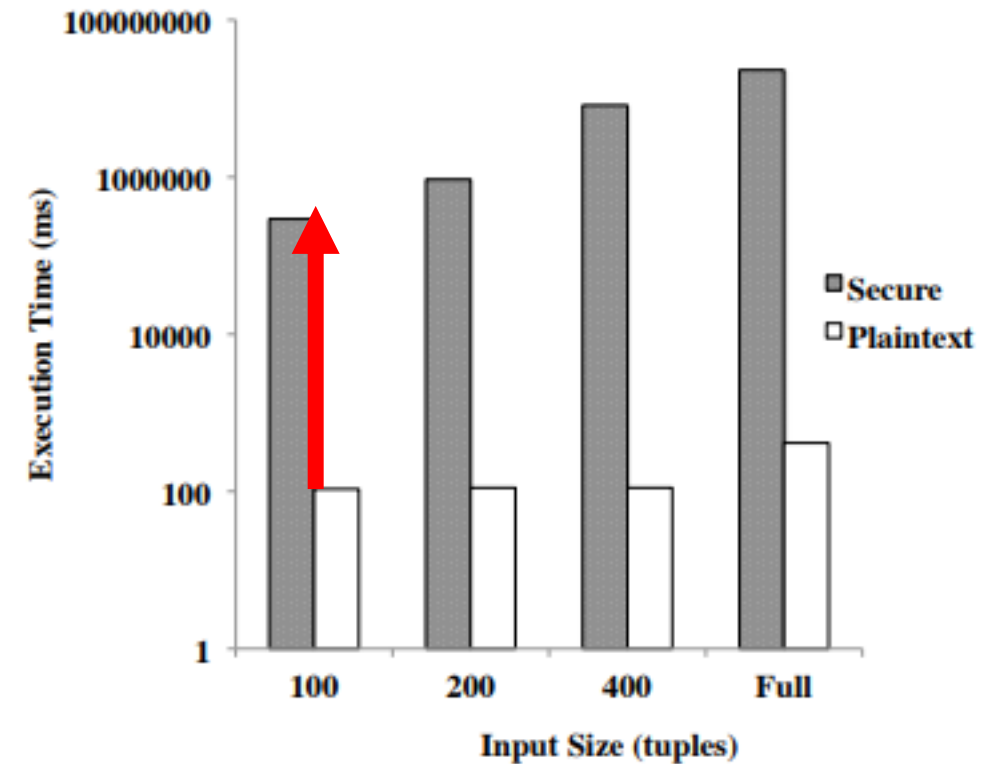


Figure 9: Runtime of *comorbidity* on increasing data sizes.

[Bater, Johes, et al. "SMCQL: Secure Query Processing for Private Data Networks." Proc. VLDB Endow. 10.6 (2017): 673-684.]



A Platform for Secure Analytics and Machine Learning

build passing docs passing License Apache 2.0 slack contact us Contributor Covenant 2.0

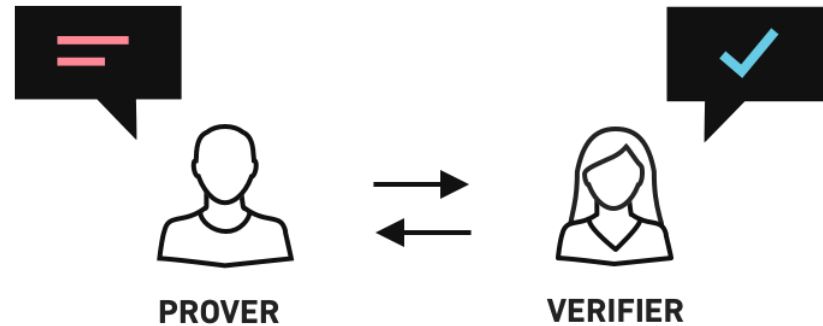
Multi-Protocol SPDZ

docs passing Azure Pipelines succeeded chat on gitter

Software to benchmark various secure multi-party computation (MPC) protocols such as SPDZ, SPDZ2k, MASCOT, Overdrive, BMR garbled circuits, Yao's garbled circuits, and computation based on three-party replicated secret sharing as well as Shamir's secret sharing (with an honest majority).

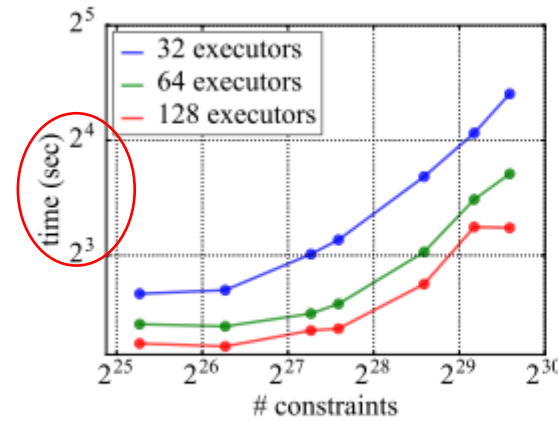
Zero Knowledge Proofs (ZKP)

- One party proves to another they know x without disclosing it
 - Used in privacy-preserving cryptocurrency like Zcash
 - Opportunities: Auditing/Regulations in Databases

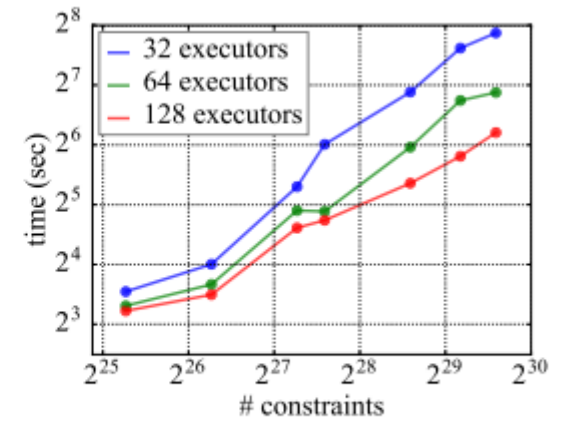


- Notoriously slow to prepare proof (seconds!) but verification is cheap (ms)
 - Operations on very large polynomials, significant setup overhead

ZKP Challenges



(a) Constraints generation



(b) Witness generation

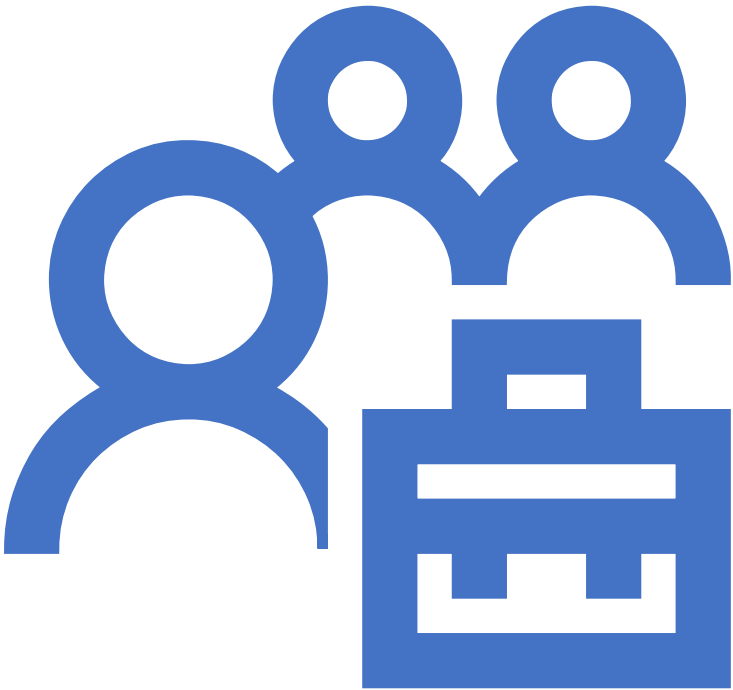
- Distributed computation can speed it up (distributed matrix operations on a large matrix)

[Wu et al. DIZK: A Distributed Zero Knowledge Proof System. USENIX Security 2018]

- Hardware ideas appearing to specialize for underlying operations

[PipeZK: Accelerating Zero-Knowledge Proof with a Pipelined Architecture. ISCA 2021]

- Integration and optimization for DBs?



Policy Compliance

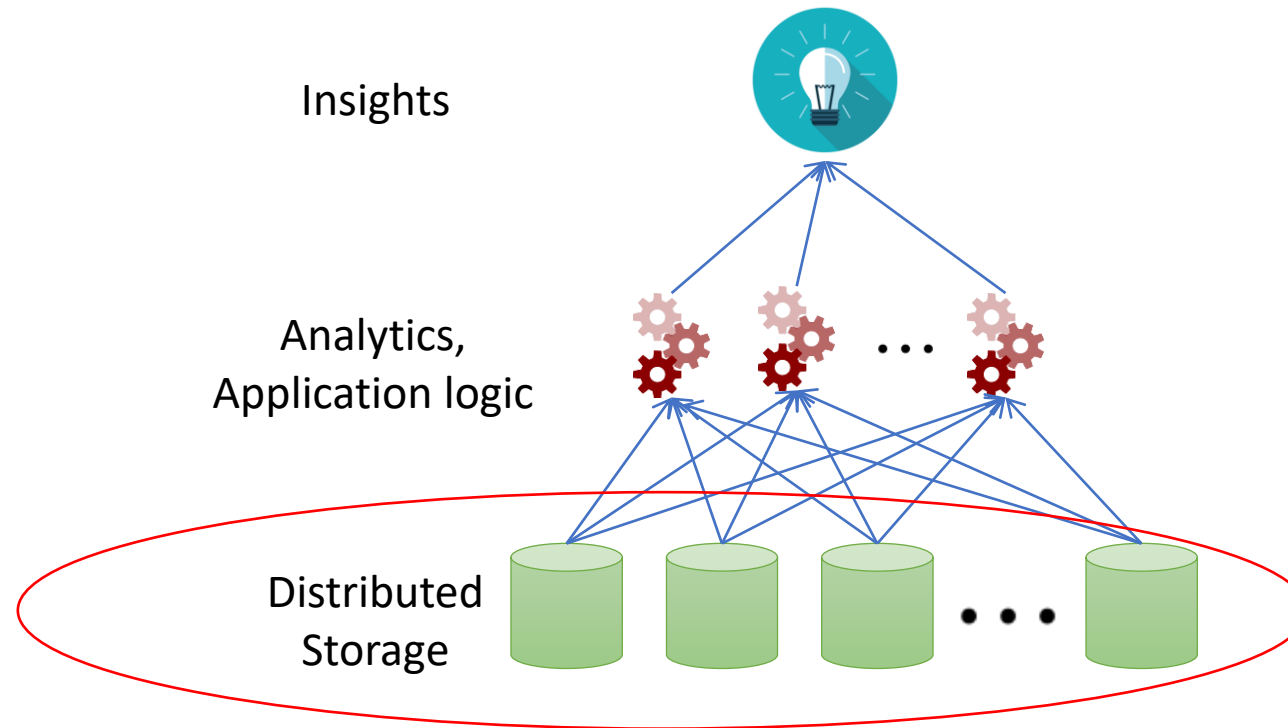
Policy Compliance in Databases

- Decades work on access control, lineage, provenance, etc.
 - Now we have a legal requirement!
- Many emerging works on aiming to ensure, e.g., CCPA or GDPR compliance
 - [Kraska et al. SchengenDB: A Data Protection Database Proposal, Poly/DMAH@VLDB 2019]
 - [Marzoev et al. Towards Multiverse Databases. HotOS 2019]
 - [Shashtri et al. Understanding and Benchmarking the Impact of GDPR on Database Systems. VLDB20],...



There is an associated slowdown!

Disaggregated Architectures and Compliance



Software-defined Data
Protection – VLDB Vision with



Soujanya Ponnappalli,
Vijay Chidambaram

How GDPR Affects Storage

- GDPR: >30% of data protection articles affect storage

[Shah et al. Analyzing the Impact of GDPR on Storage Systems. HotStorage 19]

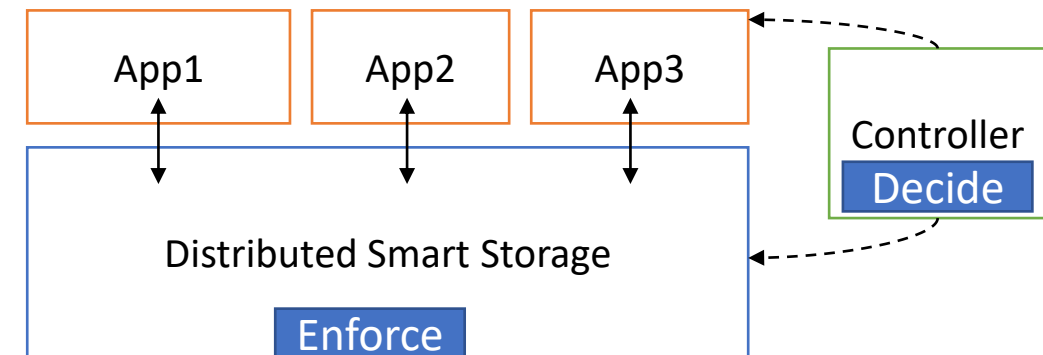
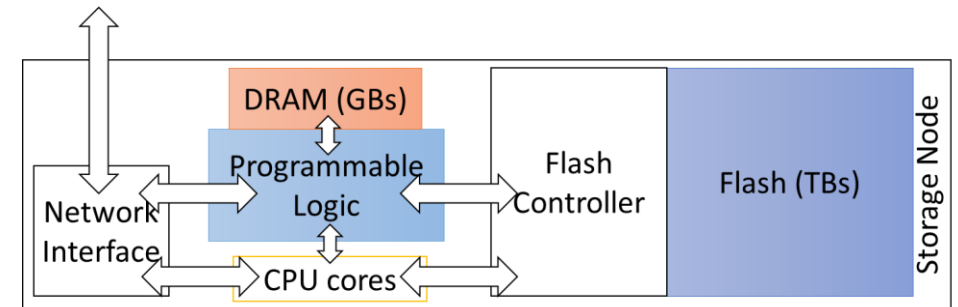
No.	GDPR article	Required functionality
5.1	Purpose limitation (data collected for specific purpose)	Fine-grained permissions
21	Right to object (data not used for objected reason)	Fine-grained permissions
5.1	Storage limitation (data not stored beyond purpose)	Deletion
17	Right to be forgotten	Deletion
15	Right of access by users	Metadata (and Secondary indexes)
20	Right to portability (transfer data on request)	Metadata (and Secondary indexes)
5.2	Accountability (ability to demonstrate compliance)	Logging and Monitoring
30	Records of processing activity	Logging
33, 34	Notify data breaches	Logging and Monitoring
25	Protection by design and by default	Encryption
32	Security of data	Encryption and Access control
13	Obtain user consent on data management	High level policy [†]
46	Transfers subject to safeguards	Location control [†]

Using Heterogenous Hardware

- Emerging Smart Storage nodes with heterogenous compute
 - Can levy re-imagined processing
 - Policies require complex decision making...
- **Software-Defined Data Protection (SDP)**
 - Decoupling enforcement from decisions increases performance

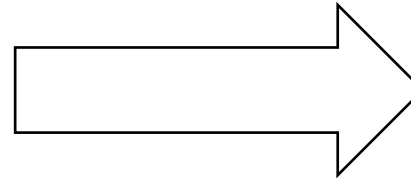


The design allows for complying with complex rules at network line-rate, e.g., with GDPR!

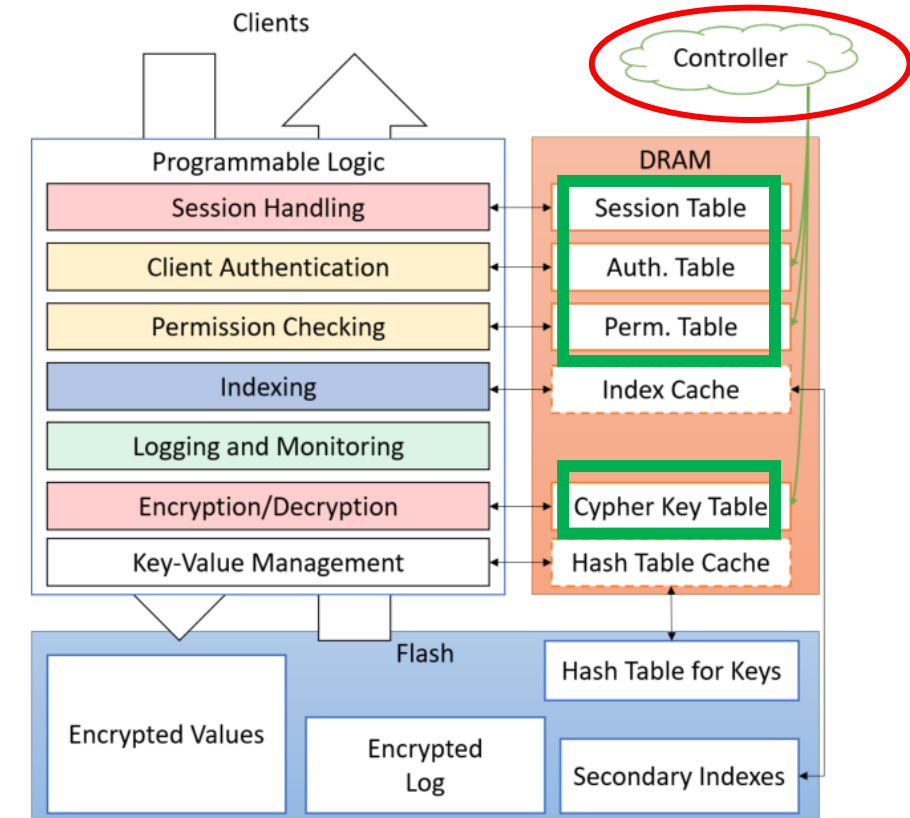


SDP Pipeline

No.	GDPR article	Required functionality
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- Achievable with state-of-the-art
- Same interface for different HW and controller implementations
- Most remaining challenges in Controller!



SDP Challenges

- Software controller: convert from “laws” to HW rules

[Krahn et al. Pesos: Policy Enhanced Secure Object Store. EuroSys'18]

[Upadhyaya et al. Automatic Enforcement of Data Use Policies with DataLawyer. SIGMOD 15], ...

- Have to trust Storage Firmware not to leak keys, etc.



Need custom TEEs!

- First step: TEEs with FPGAs in the cloud

[Zeitouni et al. Trusted Configuration in Cloud FPGAs. FCCM 2021]

[Zhao et al. ShEF: Shielded Enclaves for Cloud FPGAs. Arxiv]

- How to partition work between SW/HW?



Reliability and Trust

Reliability and Trust



- Databases/Analytics are becoming massively distributed
- Techniques from Blockchains can be useful:
 - Decentralization of trust
 - Byzantine Fault Tolerant consensus
- Slower than “regular” distributed algorithms – compute intensive *and* data movement intensive
 - Hardware can help!

Experimental Paper at
DEBS'21 with Man-Kit Sit
and Manuel Bravo



**PRIVACY
PRESERVING
COMPUTE**



FAST SQL



**POLICY
COMPLIANCE**



**RELIABILITY
AND TRUST**