# **GDPRbench**

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### Overview of this Discussion

- I. Discussing contributions of the paper
- II. Motivating the Paper
- III. Discussion of GDPRbench compliance model
  - A. GDPR primitive operations
  - B. DBMS design
- IV. Discussion of GDPRbench testing benchmarks
- V. Takeaways and Discussion

How well did you feel like you understood the

technicalities of GDPRbench?

### Contributions?

### Contributions

- 1. GDPR Primitive Operations
- 2. GDPR Compliant System Design
- 3. Performance benchmarking

### Motivating the Paper

- Databases and data storage practices are the subject of most GDPR compliance fines
- Companies have stopped serving in Europe due to compliance difficulty
- Pioneering database-centered GDPR analysis

### Database Compliance

- Establishing primitive GDPR operations and their use frequency
- Proposing database modifications in three types of DBMSs
  - Redis
  - PostgresSQL
  - System C
- Describing resulting overheads and slowdowns

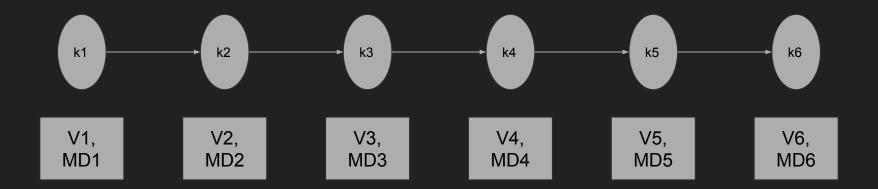
### **GDPR Primitives**

- Mostly read intensive operations with a heavy skew of these operations are from metadata
  - eg. read\_metadata\_by\_key, read\_metadata\_by\_user
- Data- and heuristic-based workloads for each of these primitive operations
  - o controller: largely write-intensive operations (add/delete record, update metadata, etc...)
  - customer/data subject: largely read-intensive operations (review data/metadata),
  - regulator: largely read-intensive operations (review system logs, etc...)
  - processor: read-intensive from metadata storage system, normal database protocols for physical data (~20% write, ~80% read)

## GDPR-compliant DB Design

- Keep separate database storing metadata and pointers to physical data database
- Add functionality to support previously stated GDPR primitive operations

### Redis\* (No SQL key-value store)



<sup>\*</sup> note that this is just for demonstration, Redis is likely more like a B+ Tree-, Skip List-, or Hash Table- based architecture that supports some highly parallel operations, but drawing those in PowerPoint wouldn't be scalable!

### PostgresSQL

- Open source, slower SQL implementation
- Many features (some malleable into GDPR-compliant framework)
- System C: similarly SQL-based and feature intensive, optimized and not open source

## GDPR Compliant DB Design Takeaways

- None of the storage systems natively support time-to-live (TTL)
- GDPR compliance is less trivial in lightweight storage systems (~400 additional LoC to Redis vs ~100 LoC to PostgresSQL)
- Existing protocols can implement most GDPR necessitated protocols (TLS, etc...)
  - Metadata indexing is especially nontrivial in Redis

### Testing Framework

- Based on Yahoo! Cloud Server Benchmark (YCSB)
- Runs tests based on primitive frequency (adjustable knobs)
- Can be used to test other implementations of GDPR compliance

### Results - Main Takeaways

- Redis scales the worst in performance and space
- PostgresSQL scales better with lower raw throughput
- "Metadata explosion"
- Performance slowdown up to 5x

# Weaknesses Strengths

## Strengths

### Weaknesses

- System-level analysis of GDPR
- Creates model of GDPR compliance
- Exhaustive list of GDPR compliant primitives and usage frequencies
- Metadata-based additions are non-intrusive adjustments to existing database structures
- Testing benchmarks give good description of performance and spatial overheads of GDPR compliance

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- Assumes strict reading of GDPR amidst ambiguity
  - Prioritizes system compliance over performance (worst-case overheads)
  - Discussion of GDPR compliance as a spectrum rather than binary
- Presumably other means of satisfying GDPR compliance other than "metadata model"
- GDPR Primitives were highly specific operations, compliance model primitives?

### **Discussion Questions**

- Does GDPRbench measure all possible forms of correctness or one model of correctness?
- Is it fair to assume no information from the database application to optimize performance?
- Do ML-based data scanners like Amazon Macie qualify as sufficient for measuring for GDPR compliance?
- Is designing for GDPR compliance inherently antithetical to reliability, performance and cost?
- All DBMSs considered are row-oriented stores. What about column-oriented stores (Vertica, MemSQL, Apache Kudu) or graph-based?
- Does it make sense to tailor DBMSs for regulators?

### Thanks!

