





Fast and efficient operational time series storage: The missing link in dynamic software analysis

Symposium on Software Performance

This research was in part funded by Bavarian Ministry of Economic Affairs and Media, Energy and Technology.

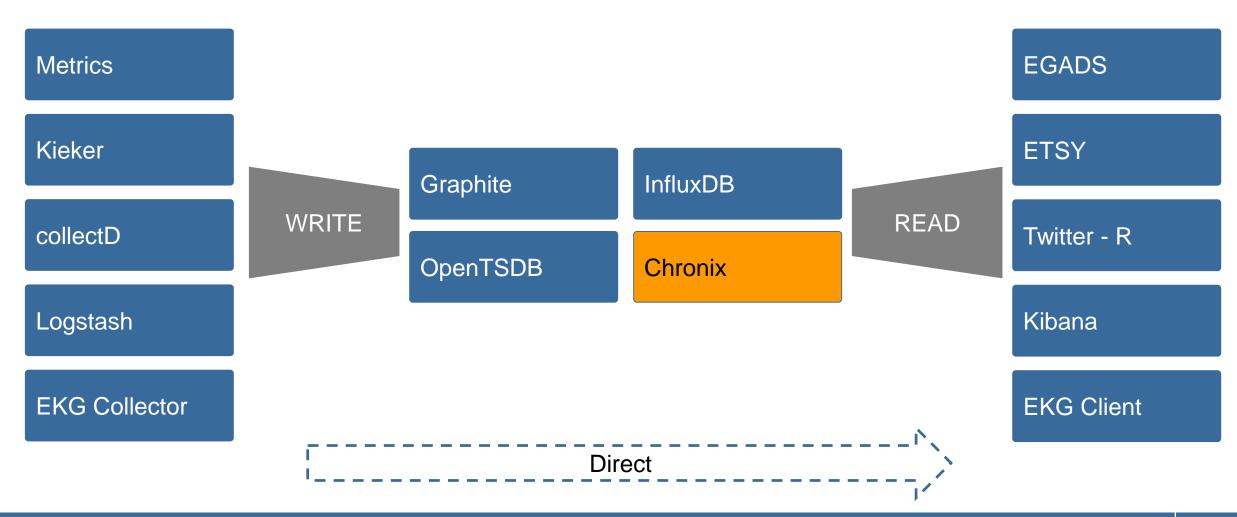
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What is operational data?

- Typical operational data are runtime metrics, e.g. CPU load, memory consumption, logs, exceptions, etc.
- Operational data is best represented as time series.
- Continuously harvested along a multitude of dimensions.
- Expected wide range of the values along each of the dimensions.
- Frequencies of time spans tend to vary a lot.

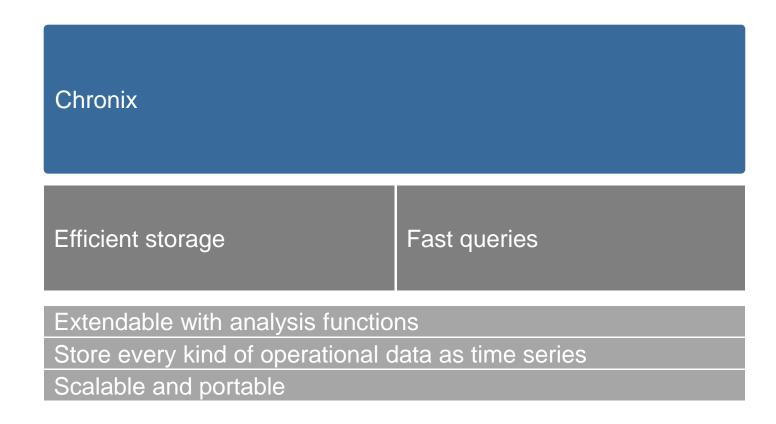
"...interactive response times often make a qualitative difference in data exploration, monitoring, online customer support, rapid prototyping, debugging of data pipelines, and other tasks." [Dremel: Interactive Analysis of Web-Scale Datasets, Sergey Melnik et al.]

A typical toolchain for dynamic software analysis: collection framework, time series storage, time series analysis framework

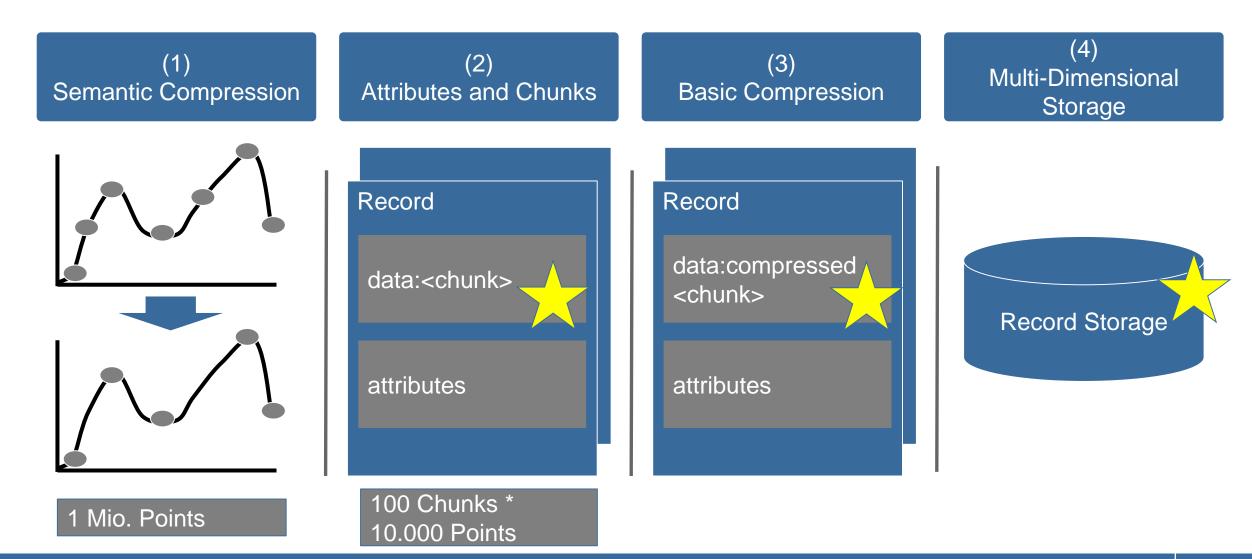


Research Question:

Is it possible to exploit the characteristic features of operational data to create a time series database that requires less space and provides faster queries?



Yes. Chronix' architecture enables both efficient storage of time series and millisecond range queries.



The key data type of Chronix is called a record. It stores a compressed chunk of the time series and its attributes.

```
record{
data:compressed{<chunk>}
//technical fields
id: 3dce1de0-...-93fb2e806d19
version: 1501692859622883300
start: 1427457011238
end: 1427471159292
//optional attributes
host: prodI5
process: scheduler
group: jmx
metric: heapMemory.Usage.Used
max: 896.571
```

Data:compressed{<chunk of time series data>}

- Time Series: time stamp, numeric value
- Traces: calls, exceptions, ...
- Logs: access, method runtimes
- Complex data: models, test coverage, anything else...

Optional attributes

- Arbitrary attributes for the time series
- Attributes are indexed
- Make the chunk searchable
- Can contain pre-calculated values

Chronix also provides aggregations and higher-level time series analyses in its query language that other TSDBs do not.

Aggregations (ag)

- Maximum
- Minimum
- Average
- Standard Deviation
- Percentile

Analyses (detect)

- A trend analysis based on a linear regression model.
- An outlier analysis using the IQR.
- A frequency analysis validating the occurrence within a defined time range.

```
q=host:prod? AND group:(jmx OR .net) & fq={!ANALYZE ag=dev}

q=host:* AND -group:(jmx OR .net) & fq={!ANALYZE detect=frequency=10:6}
```

Benchmarks represent typical use cases in time series analysis. The queries are collected from real-world analyses.

■ We have collected, arranged, and counted queries of real analyses.

Time Range (Days)	#Queries
1	30
7	30
14	10
91	2

We repeat the 72 queries 20 times to stabilize results.

- Three real-world project's operational time series data (14,195 time series, 512 Mio. points).
 - Project 1: Web application for searching car information (8 web server, 20 search server)
 - Project 2: Retail application for orders, billing, and customer relations (2 servers, 1 central database)
 - Project 3: Sales application of a car manufacturer (2 servers, 1 central database)

Chronix outperforms related TSDBs in write throughput, storage efficiency, and access times.

Table 1: Write throughput in MByte/seconds.

	Szojec,	of College	chabi	ite mini	Open T	SDB	Chronix
	70	129	4.96	2.74	0.61	11.73	11.73
09	highe.	5,400	5.24	2.69	0.63	21.26	22.88
4-33 times	3	9,600	4.19	2.73	0.55	22.86	24.12
W.	avg	5,043	4.80	2.72	0.59	18.61	19.58

Chronix outperforms related TSDBs in write throughput, storage efficiency, and access times.

Table 2: Storage demands in MBytes.

	Project		Graphite	MINITAR	Openites	Oprop	at chronit
•	1	5,400	758	144	254	4	2
	imes les	5,400	14,000	11,000	263	226	74
5-17	3	9,600	26,000	21,000	758	632	162
5	total	15,129	40,758	32,144	1,275	862	238

Chronix outperforms related TSDBs in write throughput, storage efficiency, and access times.

Table 3: Query times for $20 \cdot 72$ queries in sec.

able 5. Query times for 20 · 12 queries in sec.										
	aller	y time	STARA	ie mail	openies	DB Chroni	du Ga	>		
of th	ede	30	12.3	20.4	12.8	12.3	10.2			
0,	7	30	15.1	100.3	30.3	13.6	11.0			
	14	10	5.5	33.6	10.7	4.5	3.8		.50	0
	91	2	2.3	17.7	4.2	1.1	0.9		129-75	
	tot	tal	35.2	172.0	58.0	31.5	3.8 0.9 25.9 speeds th	as UP	N	
•	Out	lier	48.6	95.1	66.5	41.2	deth	ings		
	$\operatorname{Tr}\epsilon$	end	41.3	175.3	62.7	35.	peeds			
•	tot	tal	89.9	270.4	129.2	76.9	66.4			

Chronix is open-source. Check http://www.chronix.io/ or @ChronixDB



Chronix is currently more a proof-of-concept than production-ready. Work is going on!

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