





- Traditional data structures in HEP:
 - tuples (tables)
 - trees
 - nested tuples (trees of tuples)
 - relational (SQL-like)
- Schemafull or schemaless
- But many of our data are graph-like & schemaless
 - Entities with relations
 - G = (V, E) # graph = (vectors, edges)
- Not well covered by relational (SQL) databases
 - We don't need only a possibility to add new data with pre-defined relations
 - We need to add new relations
- Graph databases exist since a long time
 - Matured only recently thanks to Big Data & AI (adaptive NN)
 - Very good implementations & (de-facto) standards available
- > The difference between SQL and Graph DB is similar as between Fortran and C++/Java
 - On one side, a rigid system, which can be very optimized
 - On the other side, a flexible dynamical system, which allows expressing of complex structures
- GraphDB is a synthesis of OODB and SQLDB
 - Expressing web of objects without fragility of OO world
 - Capturing only essential relations, not an object dump
- Moving structure from data to code
 - Together with migration from imperative to declarative semantics
 - Things don't happen, but exist

Graph Databases for Event Index

- Original EI in Oracle
 - Too rigid (can't easily add columns, relations), other problems
- Migrated to Hadoop
 - Map files in HDFS
 - Flexible
 - Too slow for searching (ok for processing)
 - Typeless
- Partially migrated to HBase
 - Two tables: Catalog + Events
 - Tables contain a lot of ad-hoc relations (references to other entries)
 - We have in fact implemented a poor-man's GraphDB on top of HBase
- Graphical WS presenting data as graphs





	PNG histogram		PNG histogram			
	data17_13TeV.00330079.physics_CosmicCalo.merge.AOD.f843_m1824	4 evt=199452.0	data17_13TeV.00330079.physics_CosmicCalo.merge.AOD.f843_m1824	evt=199452.0		
	L1_EM3_EMPTY	144315 (72.36%)	HLT_larcallb_L1EM3_EMPTY	144315 (72.36%)		
nager !	L1_EM7_EMPTY	34159 (17.13%)	HLT_noalg_cosmiccalo_L1EM3_EMPTY	140610 (70.50%)		
	L1_TAU8_EMPTY	34068 (17.08%)	HLT_noalg_cosmiccalo_L1EM7_EMPTY	22109 (11.08%)		
	L1_J12_EMPTY	23673 (11.87%)	HLT_larcalib_L1EM7_EMPTY	15205 (7.62%)		
	L1_RD1_EMPTY	12652 (6.34%)	HLT_larps_L1EM7_EMPTY	13070 (6.55%)		
	L1_J30_EMPTY	5940 (2.98%)	HLT_larcalib_L1J12_EMPTY	13050 (6.54%)		
	L1_TAU30_EMPTY	5292 (2.65%)	HLT_noalg_cosmiccalo_L1RD1_EMPTY	12652 (6.34%)		
5545 00265573 00266211	L1_J12_ABORTGAPNOTCALIB	2284 (1.15%)	HLT_larcalib_L1TAU8_EMPTY	11751 (5.89%)		
7148 00267152 00267162	L1_J12_UNPAIRED_ISO	1228 (0.62%)	HLT_noalg_cosmiccalo_L1J12_EMPTY	9480 (4.75%)		
7385 00267599 00267638	L1_J50_ABORTGAPNOTCALIB	1052 (0.53%)	HLT_larps_L1TAU8_EMPTY	7542 (3.78%)		
0816 00270949 00270953	L1_J12_BGRP12	448 (0.22%)	HLT_larps_L1J12_EMPTY	7429 (3.72%)		
<u>1516 00271595 00271649</u>	L1 J50 UNPAIRED ISO	243 (0.12%)	HLT larps L1EM3 EMPTY	6828 (3.42%)		

EI17.1/00330079: Vive Help

Available runs

EI15

Event Index

00263962 00263964 00263965 00264034 00265532 002

00266503 00266534 00266904 00266919 00267073 00

00267167 00267358 00267359 00267360 00267367 00

00267639 00270441 00270448 00270588 00270806 002 00271048 00271298 00271370 00271388 00271421 002

Detailed Heln

Problems or Questions ? - Ask service m

Cluster by AMI	Tag	Cluster by group size	εE	xpand all clusters	
overlap threshold	is: 🗄	0	%		50%
tag level: 99 ta	rget:	null	filter:	null	Recreate

data17 13TeV.00330079.physics BphysLS.merge.AOD.f843 m1824

* Catalog - Dataset Overlaps - Trigger Statistics - Trigger Overlaps(*) - TagFile Sample - TagFile Info(*) - Journal(run)(tag)(*) - AMI * Generic: Catalog - Event Index * For experts: EI - EL - TI - Inspect - Journal - Full Service-oriented Portal (*) ... may be slow



- In production
- Simple data interpreted as a Graph by code
- To be replaced with GraphDB & generic browser \succ
- Aim: Global View of Atlas data with all relations

Data-oriented Event Index WS

https://atlas-event-index.cern.ch/EIHadoop

data18 900GeV.00349769.phy

Calo.merge.ACD.f933 m196

Run Number View

to create a sub-table datasets overlap table (command results go here too) to create a PNG or TXT view of the table or a new overlap graph PNG TXT Relational Graph EI16.1 Each cell shows overlap, union and both subtractions (on cursor hover). - Replace AOD DAOD EGAM3 DAOD EGAM3 DAG EI18.1/00348894 express express physics CosmicCalo physics Late physics Mair physics Main physic EI17.1 Show Selection deriv f921 m1955 f921 m1947 f926 m1955 p3544 f937 m1972 p3553 f926 m f921 m1947 tables shows AOD express express 20957 146 1 151 merge (20957)(22456)(22448)(22479)overlap & union, EI18.1 f921 m1955 physics_CosmicCalo 110020 639 0 0 0 Hover over cell 110881) (111693) (110020)00348154 00348197 00348231 10348251 00348353 00348354 00348403 00348440 f921 m1947 00348448 00348490 0034849 00348511 00348534 00348592 00348609 00348610 0.58%.42.60% AOD to see subtractions 00348618 00348709 00 46835 00348 50 00348885 00348894 00348895 00349011 physics Late 639 1500 0 0 0 merge 00349014 00349033 00349051 0034910, 00349109 00349111 00349114 00349159 (110881)(1500)(798) f921 m1947 00349167 00349169 00349263 00349268 00349309 00349326 00349327 00349334 DAOD EGAM3 00349335 00349451 00349481 00349498 0034 526 00349533 00349534 00349582 physics_Main 146 0 1637 1496 1388 1341 0 context-sensitive menu 00240502 00240704 00240727 00240727 00240 EI18.1/00348894: Ive Help data18 13TeV.00348894.physics ZeroBias.merge.AOD.f921 m1947 (actions on datasets) Cluster by group size Expand all clusters Cluster by AMI Tag * Catalog - Dataset Overlaps - Trigger Statistics - Trigger Overlaps - TaoF" * Generic: Catalog - Event Index overlap thresholds graph drawing options * For experts: EI - EL - TI - Inspect - Journal - Full Service-Inique Recreate (*) ... may be slow. (+) ... external service datasets overlap graph f926 m1955 express express.merge.AOD.f921 m1955







Overlaps between Tags, Unique Events







Dataset Details







Overlap Details

















Expanded Clusters

de-select to stop animation





















show all overlaps within a tag



show all overlaps between tags

EI16.1/00299184:	✓ live Help.	
Cluster by AMI Tag	Cluster by group size Expand all clusters	Context consitive many will be here
overlap thresholds:		Context-sensitive menu will be here.
tag level: 1 target:	filter: .AOD. Recreate	









Trigger Overlaps (inclusive)





shows all triggers, EXPE but only overlaps to selected ones

	Show Selection @ inclusive
851322 (6.90%)	
5515086 (44.70%	6) 🗹
1986418 (16.10%	6) 🗹
12350338 (100.1	0%) 🗹
135718 (1.10%)	
3491654 (28.30%	6) 🖉
1665630 (13 50%	ର <i>🖉</i>



A: data18_13TeV.00348885.physics_Main.merge.AOD.0937_m1972, n = 20909805 B: data18_13TeV.00348885.physics_Main.merge.AOD.0926_m1955, n = 20909805 overlap = 20099805, union = 20909805







A: data18_13TeV.00348885.physics_ZeroBias.merge.AOD.1921_m1947, n = 186395 B: data18_13TeV.00348885.express_express_merge.AOD.1921_m1947, n = 556987 overlap = 1, union = 743381



data18_13TeV.00348885.physics_ZeroBias.merge.AOD.f921_m1947 x data18_13TeV.00348885.express_express_merge.AOD.f921_m1947 Venn Diagram







HLT_10j40_L16J15 x HLT_10j40_L14J150ETA25 Venn Diagram



 $\label{eq:additional} \begin{array}{l} A: data 18_13 TeV.00348885, physics_Main.deriv.DAOD_HIGG1D1.4926_m1955_p3544, n=267984\\ B: data 18_13 TeV.00348885, physics_Main.deriv.DAOD_EXOT4.1926_m1955_p3544, n=2452676\\ overlap=61468, union=2659192\\ \end{array}$



data18_13TeV.00348885.physics_Main.deriv.DAOD_HIGG1D1.f926_m1955_p3544 x data18_13TeV Venn Diagram





Trigger Overlaps for LB Ranges



HLT_10j40_L16J15 x HLT_10j40_L14J150ETA25 overlaps for data18_13TeV.00351364.physics_Main.merge.AOD.#937_m1972 (per LB ranges, normalised to nevents)



L1_XE55 x L1_XE50 overlaps for data18_13TeV.00351384.ptysics_Main.merge.AOD.f837_m1972 (per LB ranges, normalised to nevents



L1_XE55 x L1_XE50 Venn Diagram - LB Graph(*)

HLT_10j40_L16J15 x HLT_10j40_L14J150ETA25 Venn Diagram - LB Graph









	PNG histogram		PNG histogram	
Index	data17_13TeV.00330079.physics_CosmicCalo.merge.AOD.f843_m1824	4 evt=199452.0	data17_13TeV.00330079.physics_CosmicCalo.merge.AOD.f843_m1824	evt=199452.0
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Questions ? - Ask service manager !	L1_EM7_EMPTY	34159 (17.13%)	HLT_noalg_cosmiccalo_L1EM3_EMPTY	140610 (70.50%)
li de la companya de	L1_TAU8_EMPTY	34068 (17.08%)	HLT_noalg_cosmiccalo_L1EM7_EMPTY	22109 (11.08%)
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00267360 00267367 00267385 00267599 00267638	L1_J50_ABORTGAPNOTCALIB	1052 (0.53%)	HLT_larps_L1TAU8_EMPTY	7542 (3.78%)
3 00270588 00270806 00270816 00270949 00270953	L1_J12_BGRP12	448 (0.22%)	HLT_larps_L1J12_EMPTY	7429 (3.72%)
<u>0 00271388 00271421 00271516 00271595 00271649</u>	L1_J50_UNPAIRED_ISO	243 (0.12%)	HLT_larps_L1EM3_EMPTY	6828 (3.42%)

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00263962 00263964 002639 00266503 00266534 002669 00267167 00267358 002673 00267639 00270441 002704

EI15

Event

Cluster b	y Al	MI Tag	Cluster by group siz	e E	xpand all clusters	
overlap thr	resh	olds: 🗉	0	%		50%
tag level:	99	target:	null	filter:	null	Recreate

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Calo.merge.ACD.f933 m196





Standards & Choices



Functional syntax with additional navigational semantics !

De-facto standard language/api: Gremlin

- <u>Gremlin is a functional, data-flow language to traverse a property graph.</u> Every Gremlin traversal is composed of a sequence of (potentially nested) steps. A step performs an atomic operation on the data stream. Every step is either a *map*-step (transforming the objects in the stream), a *filter*-step (removing objects from the stream), or a *sideEffect*-step (computing statistics about the stream).
- Gremlin supports **transactional** & **non-transactional** processing in **declarative** or **imperative** manner.
- Gremlin can be expressed in all languages supporting function composition & nesting.
- Supported languages: Java, Groovy, Scala, Python, Ruby, Go, ...
- Commonly used framework: TinkerPop
- Leading implementation: JanusGraph
 - Supported storage backends: Cassandra, HBase, Google Cloud, Oracle BerkeleyDB
 - Supported graph data analytics: Spark, Giraph, Hadoop
 - Supported searches: Elastic Search, Solr, Lucene
 - Other candidate: Neo4j, the same Gremlin interface, used by Atlas Geometry DB
- Chosen visualisation: visj.org



















GraphDB Schema for EI



https://atlas-event-index.cern.ch/GraphDB-doc/Gremlin/schema.gremlin









how to present "dataset" vertex

how to show it (can contain Gremlin or JS code)

"dataset":

```
graphics: {
    label:{gremlin:"sideEffect(values('prodStep').store('4')).sideEffect(values('dataType').....values().join().toString()"},
    title:"dataType",
    subtitle:{gremlin:"values('nevents').join().toString().concat(' events')"},
    group:{gremlin:"in().hasLabel('amitag').values('version')"},
    shape:{js:"if(title=='dataset:AOD') {shape = 'hexagon';} else {shape = 'dot';}"},
    value:{gremlin:"values('nevents').join().toString()"}
    },
    actions: [
    {name:"Catalog", url:"https://atlas-event-index.cern.ch/EIHadoop/CatalogView.jsp?query=dataset:"},
    {name:"Sample", url:"https://atlas-event-index.cern.ch/EIHadoop/InspectView.jsp?view=txt&action=dump&climit=1&limit=10&query=dataset:"},
    {name:"Info", url:"https://atlas-event-index.cern.ch/EIHadoop/InspectView.jsp?view=txt&action=info&climit=1&limit=10&query=dataset:"}
},
```

external actions







- Using HBase backend
- Subset of data imported
- Most of the graphical part implemented
 - By standalone JS implementation









- > Functional syntax
- > Functional & **navigational** semantics

```
# add a vertex 'experiment' with the name 'ATLAS'
g.addV('experiment').property('ename', 'ATLAS')
# add edges 'owns' from all vertices 'project' to vertex 'experiment' 'ATLAS'
g.V().hasLabel('project').<u>addE('owns').from(g.V().hasLabel('experiment').has('ename', 'ATLAS')</u>)
# a function deriving a dataset name (which is not stored as such)
# from existing dataset relations by traversing the graph
def datasetName(d) {
  return d.sideEffect(values("prodStep").store("4"))
          .sideEffect(values("dataType").store("5")).in()
          .sideEffect(hasLabel("run").values("rname").store("2"))
          .sideEffect(hasLabel("amitag").values("version").store("6"))
          .sideEffect(hasLabel("stream").values("sname").store("3"))
          .sideEffect(hasLabel("run").in().hasLabel("project").values("pname").store("1"))
          .cap("1", "2", "3", "4", "5", "6").next().values().join().toString()
```



<u>Graph Database for EI</u> <u>Event Lookup (Performance - 1)</u>						
<pre>gremlin> el(358031, 775206623, g).profile() ==>Traversal Metrics </pre>	Count	T	Time (me)	% D		
Step	Count		IIME (MS)	⁄∂ Du		
<pre>JanusGraphStep([],[~label.eq(event), enumber.eq _condition=(~label = event AND enumber = 775206623) _isFitted=true _query=multiKSQ[1]@2147483647 _index=event:enumber:u _orders=[] _isOndered_true</pre>	1	1	204.805	75.7		
_1SUrdered=true			1 611			
ontimization			130 444			
backend-querv	1		7.742			
\ guery=event:enumber:u:multiKSO[1]@2147483647						
<pre>JanusGraphVertexStep(IN,[keeps],vertex) _condition=type[keeps] _isFitted=true _vertices=1 _query=org.janusgraph.diskstorage.keycolumnvalue.S]</pre>	1 iceQuery@b3a55b7f	1	25.560	9.4		
_orders=[]						
_isOrdered=true						
optimization			11.927			
<pre>packena-query _query=org.janusgraph.diskstorage.keycolumnvalue.Sl</pre>	iceQuery@b3a55b7f		3.103			

Graph Databa	se for EI		(stewartyphysics, Coar	inCatb) amtag (503_m1980)
Évent Lookup (Perforn	<u>nance - 2)</u>		data18_9000av/00046	789,¢tyvics_comicCitio.merge ACO.1933_m1990
JanusGraphVertexStep(IN,[fills],vertex) _condition=type[fills] _isFitted=true	1	1	10.300	5.84
<pre>_vertices=1 _query=org.janusgraph.diskstorage.keycolumnvalue.S] _orders=[] \ isOrdered=true</pre>	liceQuery@b3a605c1			
optimization			7.661	
backend-query	1		1.442	
\ query=org.janusgraph.diskstorage.keycolumnvalue.S	liceQuery@b3a605c1			
HasStep([rnumber.eq(358031)])	1	1	13.129	4.86
SelectOneStep(last,e)	1	1	0.993	0.37
NoOpBarrierStep(2500)	1	1	0.159	0.06
<pre>JanusGraphPropertiesStep([guid],value)</pre>	2	2	14.800	5.47
<pre>_vertices=1 _query=org.janusgraph.diskstorage.keycolumnvalue.S] _orders=[] _isOrdered=true</pre>	liceQuery@b11f98a7			
optimization			7.478	
NoOpBarrierStep(2500)	2	2	0.568	0.21
>TOTAL	-	-	270.406	-

75% of the time is spend by the entry point search, following graph traversal is very fast



Event Index Migration

- Export of existing data as Gremlin source
- Executing Gremlin source
 - Filling JanusGraph with data in tabular form
- Re-arranging JanusGraph data with Gremlin script
 - Creating graph
- Slow, but very flexible procedure
 - Useful for evaluation
- Next step:
 - Install JanusGraph together with El Core to enable
 - Performance evaluation
 - Data migration
 - Code migration



- Data (almost) without structure
- Complex code (error-prone)

- Structured data
- Interpreted by JanusGraph





<u>(not serious)</u>

Lineary provide Control (Lineary provide) (Linea

- > Physical configuration of non-default set of tools
 - API ok
- Coexistence with Hadoop/HBase
 - Many overlapping libs with different versions
- Naive JavaScript implementation
 - Should use a framework
- JavaScript Gremlin client exists only for Node.js
 - Browser-based client being developed here
 - Not completely generic
- No good generic Gremlin GUI
 - Some very good special-purpose GUIs, or commercial ones
 - Our developpement already quite good
 - Generic, customised by powerful stylesheet
- > Web Service (Gremlin Service) security
 - As always





wrt current implementation



> Big part of the current Core absorbed in GraphDB structure

- In past, we had in fact implemented our own GraphDB
 - Common development pattern in HEP :-)
- Apache/Tomcat service not needed
 - JavaScript client connects directly do Gremlin server
- No special CLI API needed
 - Standard Gremlin functions used
 - Can provide command wrappers for backward compatibility
- Using standards
 - So components can be replaced
 - JanusGraph with Neo4J
 - Hadoop with Cassandra
- > New interface with the same (and enhanced) functionality
 - Also for WS
- Same or better performance
 - As the internal DB structure is very similar + better code



<u>Try</u> It !



- Growing documentation: <u>https://atlas-event-index.cern.ch/GraphDB-doc</u>
- Web GUI (should work inside CERN): <u>http://aiatlas016.cern.ch/GraphDB</u>

A 'playground' has been installed @aiatlas016.

It contains the full Catalog, several datasets and DOverlap tables.

To play with it: connect to aiatlas016 as atlevind

(or checkout https://:@gitlab.cern.ch:8443/atlas-event-index/GraphDB.git).

- \$ cd work/DB/GraphDB/ant
- \$ source setup.sh
- \$ gremlin_local

And try some examples from

https://atlas-event-index.cern.ch/GraphDB-doc/Gremlin/examples.gremlin https://atlas-event-index.cern.ch/GraphDB-doc/Gremlin/functions.gremlin https://atlas-event-index.cern.ch/GraphDB-doc/Gremlin/tests.gremlin