



Stream and Complex Event Processing Discovering Existing Systems: esper

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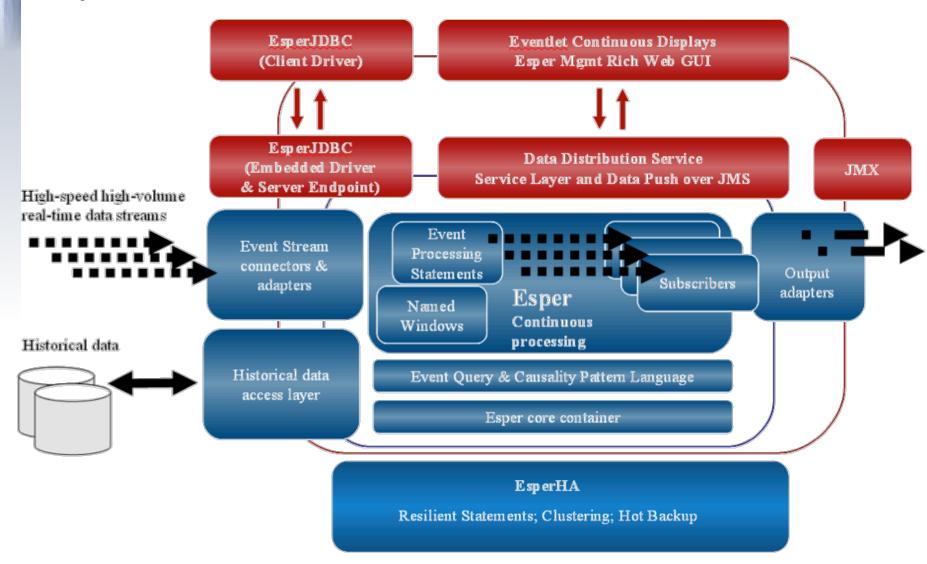
Agenda

- Introduction
- Describing Events
- Event Stream Analysis
- Event Pattern Matching
- Combinations
- Resources

Esper

- Motto
 - EsperTech's Event Stream and Complex Event Processing software turns large volume of disparate real-time event streams into actionable intelligence.
- Esper
 - Event Processing for Java
- Nesper
 - Event Processing for .Net

Esper Architecture



Esper Features at a glance 1/4

- Efficient Event Processing
 - Continuous queries, filtering, aggregations, joins, sub-queries
 - Comprehensive pattern detection
 - Pull and Push
 - High performance, low latency

Esper Features at a glance 2/4

- Extensible Middleware
 - Java, .Net, Array, Map or XML events
 - Runtime statement management
 - API or configuration driven
 - Plug-in SDK for functions, aggregations, views and pattern detection extensions
 - Adapters: CSV, JMS in/out, API, DB, Socket, HTTP
 - Runtime management, operational visibility, interoperability
 - Data distribution service for data push management and service layer

Esper Features at a glance 3/4

- Rich Web-Based User Interface
 - Real-time event displays: Eventlet technology allows customizable and interactive continuous displays
 - CEP engine management
 - Design EPL Statements
 - Drill-down and browser script
 - integration

Esper Features at a glance 4/4

- HA enabled (EsperHA)
 - Per statement configuration
 - Transient combinable with fully resilient behaviour
 - Hot standby API, hot backup
 - Highly optimized and fast data storage technology
 - Engine state RDBMS storage option

Event Stream and Complex Event Processing

- Design continuous queries and complex causality relationships between disparate event streams with an expressive Event Processing Language (EPL).
- EPL statements are registered into (N)Esper and continuously executed as live data streams are pushed through.

Rapid development and deployments

- EPL has a "SQL look alike"
- EPL statement matches trigger plain Java or .Net/C# objects for real-time customized actionable intelligence.
- (N)Esper is pure Java/.Net and can run standalone or embedded into existing middleware systems (application servers, services bus, in- house systems).

Running Example

 Count the number of fires detected using a set of smoke and temperature sensors in the last 10 minutes

Events

- Smoke Event: String sensor, boolean state
- Temperature Event: String sensor, double temperature
- Fire Event: String sensor, boolean smoke, double temperature

Condition:

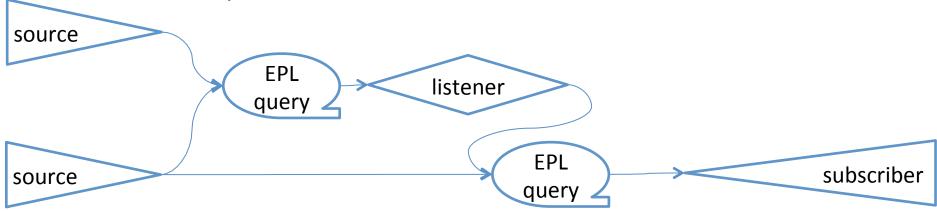
 Fire: at the same sensor smoke followed by temperature>50

Query Processing Model in Esper 1/2

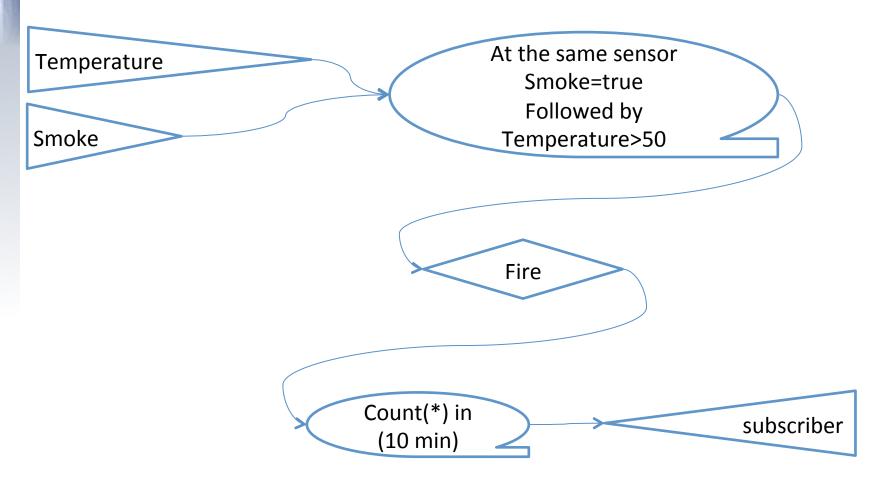
- The Esper processing model is continuous
- Four abstractions
 - Sources
 - Push based
 - Data tuples from sensors, trace files, etc.
 - Registered EPL Queries
 - Push Based
 - Continuously executed against the events produced by the sources
 - Listeners
 - Receive data tuples from queries
 - Push data tuples to other queries
 - Subscribers
 - Receive processed data tuples

Query Processing Model in Esper 2/2

- Sources, queries, listeners and subscribers are manually connected to form graphs
 - Sources act as input
 - Subscribers act as output
 - EPL Queries integrate sources
 - Listeners propagates query results (they act internal sources)



Graph for the running example



- Possible methods:
 - Java classes, Maps, XML, EPL
- Java classes are a simple, rich and versatile way to represent events in Esper.
 - Follow JavaBeans-style getter methods and property names

Method	Property Name
getQ()	q
getQN()	qn

Temperature event for the running example

- TemperatureSensorEvent
 - sensor
 - △ temperature
 - △ timeStamp
 - TemperatureSensorEvent(String, double, long)
 - getSensor() : String
 - getTemperature() : double
 - getTimeStamp() : Date
- Note: in this and in the following examples the timeStamp property is not necessary

Smoke event for the running example

- SmokeSensorEvent
 - sensor
 - smoke
 - △ timeStamp
 - SmokeSensorEvent(String, boolean, long)
 - getSensor() : String
 - getSmoke(): boolean
 - getTimeStamp() : Date

Fire event for the running example

- FireComplexEvent
 - sensor
 - smoke
 - △ temperature
 - △ timeStamp
 - FireComplexEvent(String, boolean, double)
 - FireComplexEvent(String, boolean, double, long)
 - getSensor() : String
 - getSmoke(): boolean
 - getTemperature() : double
 - getTimeStamp() : Date

Declaring an event type via the create schema

 EPL allows declaring an event type via the create schema clause and also by means of the static or runtime configuration API addEventType functions.

Syntax

create schema schema_name [as] (property_name property_type [,...])
 [inherits inherited_event_type[, inherited_event_type] [,...]]

Example

 create schema FireComplexEvent (sensor string, smoke boolean, temperature double);

Event Processing Language (EPL)

- EPL statements
 - derive and aggregate information from one or more streams of events,
 - to join or merge event streams, and
 - to feed results from one event stream to subsequent statements.

Event Processing Language (EPL)

- EPL is similar to SQL in its use of the *select* clause and the *where* clause.
- EPL statements instead of tables use event streams and a concept called *views*.
- Views are similar to tables in an SQL statement
 - They define the data available for querying and filtering.
 - They can represent windows over a stream of events.
 - They can also sort events, derive statistics from event properties, group events or handle unique event property values.

EPL Syntax

```
[insert into insert into def]
select select list
from stream def [as name] [, stream def [as
name]] [,...]
[where search conditions]
[group by grouping expression list]
[having grouping_search_conditions]
[output output specification]
[order by order by expression list]
[limit num rows]
```

Simple examples

- Look for specific events
 - select * from SensorEventStream where temperature>50
- Aggregate several events
 - select avg(temperature) from SensorEventStream
- Joining two streams
 - select Tstream.sensor, Tstream.temperature, Sstream.smoke
 - from TemperatureEventStream as Tstream, SmokeEventStream as Sstream
 - where Tstream.sensor = Sstream.sensor and Tstream.temperature>50 and Sstream.smoke=true

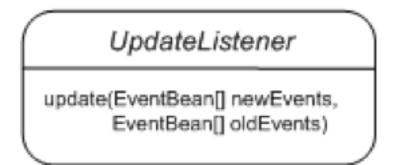
The EPL alone is not enough ...

```
Configuration cepConfig = new Configuration();
cepConfig.addEventType("TemperatureEventStream",
                  TemperatureSensorEvent.class.getName());
cepConfig.addEventType("SmokeEventStream",
                        SmokeSensorEvent.class.getName());
String query = "<<any of the three in the previous slide>>";
EPServiceProvider cep =
  EPServiceProviderManager.getProvider("myCEP", cepConfig);
EPRuntime cepRT = cep.getEPRuntime();
EPAdministrator cepAdm = cep.getEPAdministrator();
EPStatement cepStatement = cepAdm.createEPL(query);
cepStatement.addListener(new CEPListener());
```

See also HelloWorldEsper in the Esper ready to go pack on the course Website

Listening to EPL query results 1/3

The interface for listeners is com.espertech.esper.client.UpdateListener. Implementations must provide a single update method that the engine invokes when results become available



Listening to EPL query results 2/3

 The engine provides statement results to update listeners by placing results in com.espertech.esper.client.EventBean instances. A typical listener implementation queries the EventBean instances via getter methods to obtain the statement-generated results.

EventBean

get(String propertyName) : Object

getUnderlying(): Object

getEventType(): EventType

Listening to EPL query results 3/3

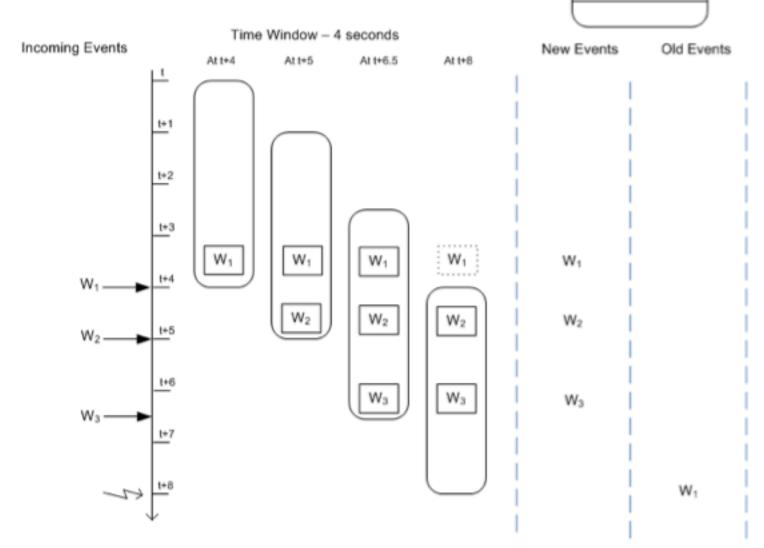
For instance, the following code prints each new event received

NOTE: similar code can be used to access the events that are exiting the window (oldData), see also next slides.

Windows

Туре	Syntax	Description
Logical Sliding	win:time(time period)	Sliding time window extending the specified time interval into the past.
Logical Tumbling	win:time_batch(time period[,optional reference point] [, flow control])	Tumbling window that batches events and releases them every specified time interval, with flow control options.
Physical Sliding	win:length(size)	Sliding length window extending the specified number of elements into the past.
Physical Tumbling	win:length_batch(size)	Tumbling window that batches events and releases them when a given min- imum number of events has been col- lected.

Logical Sliding windows



UpdateListener

Logical Sliding windows: example

Query

select avg(temperature) from TemperatureEventStream.win:time(4 sec)

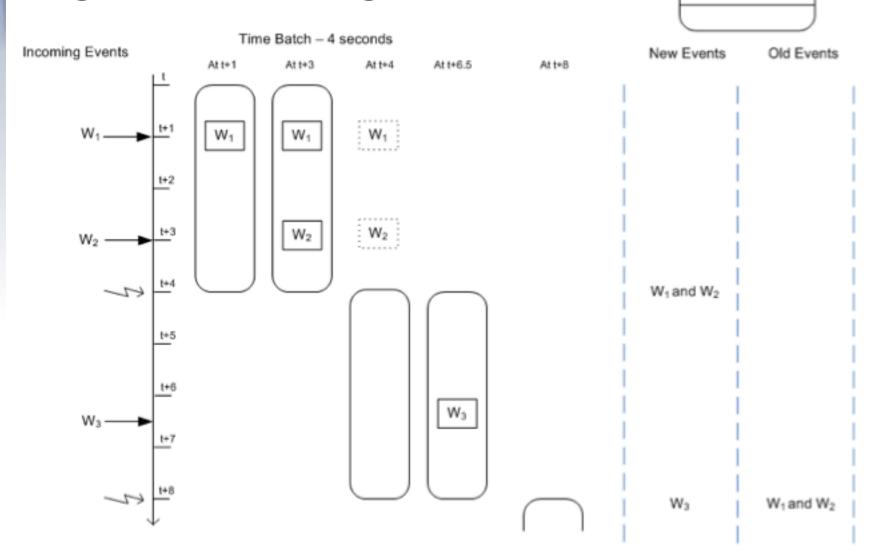
Execution trace

Sending Event:[S0|915.0|Mon Apr 29 13:05:49 CEST 2013] Sending Event:[S1|24.0|Mon Apr 29 13:05:44 CEST 2013] Event received: {avg(temperature)=254.25} Event received: {avg(temperature)=24.0} Event received: {avg(temperature)=338.666666666667} Sending Event: [S1|55.0| Mon Apr 29 13:05:45 CEST 2013] Event received: {avg(temperature)=467.5} Event received: {avg(temperature)=39.5} Sending Event: [SO | 1.0 | Mon Apr 29 13:05:46 CEST 2013] Event received: {avg(temperature)=915.0} Event received: {avg(temperature)=null} Event received: {avg(temperature)=26.6666666666668} Sending Event: [S0|30.0| Mon Apr 29 13:05:54 CEST 2013] Sending Event: [S1|81.0| Mon Apr 29 13:05:47 CEST 2013] Event received: {avg(temperature)=40.25} Event received: {avg(temperature)=30.0} Event received: {avg(temperature)=45.66666666666664} Esper, when using logical sliding windows, reports as soon as a new event Sending Event: [S0 | 20.0 | Mon Apr 29 13:05:48 CEST 2013] Event received: {avg(temperature)=39.25}

arrives and an old one expires

Event received: {avg(temperature)=34.0}

Logical Tumbling windows



UpdateListener

Logical Tumbling windows: example

Query

select avg(temperature)
from TemperatureEventStream.win:time_batch(4 sec)

Execution trace

Sending Event: [S1|42.0|Mon Apr 29 13:31:44 CEST 2013]
Sending Event: [S1|55.0|Mon Apr 29 13:31:45 CEST 2013]
Sending Event: [S1|10.0|Mon Apr 29 13:31:46 CEST 2013]
Sending Event: [S1|25.0|Mon Apr 29 13:31:47 CEST 2013]
Event received: {avg(temperature)=33.0}
Sending Event: [S0|23.0|Mon Apr 29 13:31:48 CEST 2013]
Sending Event: [S1|276.0|Mon Apr 29 13:31:49 CEST 2013]
Event received: {avg(temperature)=149.5}

Sending Event: [S0|76.0| Mon Apr 29 13:31:54 CEST 2013]

Sending Event: [S0 | 20.0 | Mon Apr 29 13:31:55 CEST 2013]

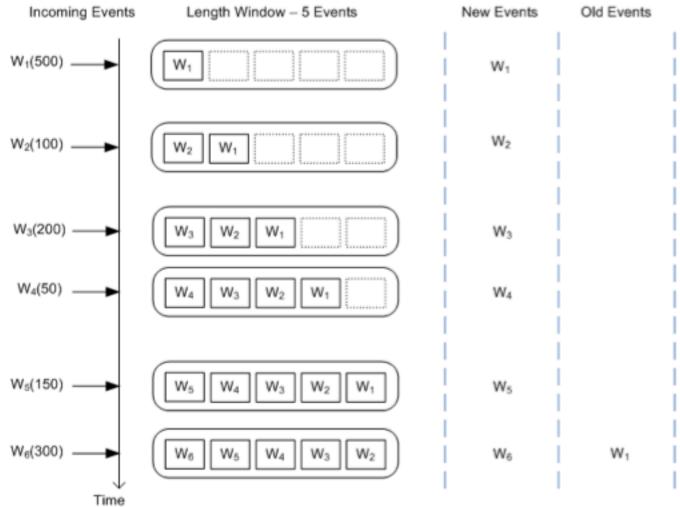
Sending Event: [S0|97.0| Mon Apr 29 13:31:56 CEST 2013] Sending Event: [S0|59.0| Mon Apr 29 13:31:57 CEST 2013] Event received: {avg(temperature)=78.0}

Esper, when using logical tumbling windows, reports only when the window closes

Event received: {avg(temperature)=48.0}

Physical sliding windows





Physical sliding windows: example

Query

select avg(temperature) from TemperatureEventStream.win:length(5)

Execution trace

Sending Event: [\$1|6.0|Mon Apr 29 13:35:50 CEST 2013]

Event received: {avg(temperature)=6.0}

Sending Event: [S0 | 48.0 | Mon Apr 29 13:35:51 CEST 2013]

Event received: {avg(temperature)=27.0}

Sending Event: [S0|23.0| Mon Apr 29 13:35:52 CEST 2013]

Event received: {avg(temperature)=25.6666666666668}

Sending Event: [S1 | 89.0 | Mon Apr 29 13:35:53 CEST 2013]

Event received: {avg(temperature)=41.5}

Sending Event: [S0|54.0|Mon Apr 29 13:35:54 CEST 2013]

Event received: {avg(temperature)=44.0}

Sending Event: [S0 | 877.0 | Mon Apr 29 13:35:55 CEST 2013]

Event received: {avg(temperature)=218.2}

Sending Event: [S1 | 42.0 | Mon Apr 29 13:36:00 CEST 2013]

Event received: {avg(temperature)=217.0}

Sending Event: [S1 | 7.0 | Mon Apr 29 13:36:01 CEST 2013]

Event received: {avg(temperature)=213.8}

Sending Event: [S0|23.0| Mon Apr 29 13:36:02 CEST 2013]

Event received: {avg(temperature)=200.6}

Sending Event: [SO | 10.0 | Mon Apr 29 13:36:03 CEST 2013]

Event received: {avg(temperature)=191.8}

Esper, when using physical sliding windows, reports as soon as a new event arrives

Physical Tumbling windows: example

Query

select avg(temperature)
from TemperatureEventStream.win:length batch(5)

Execution trace

Sending Event: [S1 | 66.0 | Mon Apr 29 13:40:06 CEST 2013]
Sending Event: [S0 | 42.0 | Mon Apr 29 13:40:07 CEST 2013]
Sending Event: [S1 | 51.0 | Mon Apr 29 13:40:08 CEST 2013]
Sending Event: [S0 | 10.0 | Mon Apr 29 13:40:09 CEST 2013]
Sending Event: [S1 | 61.0 | Mon Apr 29 13:40:10 CEST 2013]
Event received: {avg(temperature)=46.0}
Sending Event: [S0 | 621.0 | Mon Apr 29 13:40:11 CEST 2013]
Sending Event: [S0 | 40.0 | Mon Apr 29 13:40:16 CEST 2013]
Sending Event: [S0 | 84.0 | Mon Apr 29 13:40:17 CEST 2013]
Sending Event: [S1 | 21.0 | Mon Apr 29 13:40:18 CEST 2013]

Sending Event: [S0|43.0| Mon Apr 29 13:40:19 CEST 2013]

Esper, when using physical tumbling windows, reports only when the window closes

Event received: {avg(temperature)=161.8}

Controlling Reporting

- The output clause is optional in Esper
- It is used
 - To control the rate at which events are output
 - to suppress output events.
- Syntax
 - Output [[all | first | last | snapshot] every output_rate [seconds | events]]

Event Stream Analysis

Controlling Reporting: examples

- Controlling the sliding in logical and physical windows
 - select avg(temperature)
 from TemperatureEventStream.win:time(4 sec)
 output snapshot every 2 sec
 - select avg(temperature)
 from TemperatureEventStream.win:length(4)
 output snapshot every 2 events

- Event patterns match when an event or multiple events occur that match the pattern's definition.
- Patterns can also be temporal (time-based).
- Pattern matching is implemented via state machines.

Pattern atoms

- Filter expressions specify an event to look for.
 - TemperatureEventStream(sensor="S0", temperature>50)
- Time-based event observers specify time intervals or time schedules.
 - timer:interval(10 seconds)
 - timer:at(5, *, *, *, *)

Every 5 minutes

Types of operators

- Operators that control pattern finder creation and termination: every, every-distinct, [num] and until
- Logical operators: and, or, not
- Temporal operators that operate on event order:
 -> (followed-by)
- Guards are where-conditions that filter out events and cause termination of the pattern finder, such as timer:within, timer:withinmax and while-expression
- Note: Pattern expressions can be nested arbitrarily deep by including the nested expression(s) in () round parenthesis.

Pattern example

Query

```
select a.sensor
from pattern [every ( a = SmokeEventStream(smoke=true) ->
TemperatureEventStream(temperature>50, sensor=a.sensor)
where timer:within(2 sec) ) ]
```

Execution trace

```
Sending Event: [S0|false|Mon Apr 29 14:33:54 CEST 2013] Sending Event: [S1|28.0|Mon Apr 29 14:33:55 CEST 2013] Sending Event: [S1|true|Mon Apr 29 14:33:56 CEST 2013] Sending Event: [S1|43.0|Mon Apr 29 14:33:57 CEST 2013] Sending Event: [S0|true|Mon Apr 29 14:33:58 CEST 2013] Sending Event: [S0|74.0|Mon Apr 29 14:33:59 CEST 2013] Event received: {a.sensor=S0} Sending Event: [S0|true|Mon Apr 29 14:34:00 CEST 2013] Sending Event: [S0|70.0|Mon Apr 29 14:34:01 CEST 2013] Event received: {a.sensor=S0}
```

Pattern operators: every

- The every operator indicates that the pattern sub-expression should restart when the subexpression qualified by the every keyword evaluates to true or false.
- Without the every operator the pattern subexpression stops when the pattern subexpression evaluates to true or false
- Every time a pattern sub-expression within an every operator turns true the engine starts a new active sub-expression looking for more event(s) or timing conditions that match the pattern subexpression.

Pattern operators: every

- This pattern fires when encountering an A event and then stops looking:
 - A
- This pattern keeps firing when encountering A events, and doesn't stop looking:
 - every A

Pattern operators: every (A -> B)

- Events
 - $A_1 B_1 C_1 B_2 A_2 D_1 A_3 B_3 E_1 A_4 F_1 B_4$
- Pattern
 - every (A -> B)
- Results
 - Detect an A event followed by a B event. At the time when B occurs the pattern matches, then the pattern matcher restarts and looks for the next A event.
 - 1. Matches on B_1 for combination $\{A_1, B_1\}$
 - 2. Matches on B_3 for combination $\{A_2, B_3\}$
 - 3. Matches on B_{α} for combination $\{A_{\alpha}, B_{\alpha}\}$

Pattern operators: every A -> B

- Events
 - $A_1 B_1 C_1 B_2 A_2 D_1 A_3 B_3 E_1 A_4 F_1 B_4$
- Pattern
 - every A -> B
- Results
 - The pattern fires for every A event followed by a B event.
 - 1. Matches on B_1 for combination $\{A_1, B_1\}$
 - 2. Matches on B_3 for combination $\{A_2, B_3\}$ and $\{A_3, B_3\}$
 - 3. Matches on B_4 for combination $\{A_4, B_4\}$

Pattern operators: A -> every B

- Events
 - $A_1 B_1 C_1 B_2 A_2 D_1 A_3 B_3 E_1 A_4 F_1 B_4$
- Pattern
 - A -> every B
- Results
 - The pattern fires for an A event followed by every B event.
 - 1. Matches on B_1 for combination $\{A_1, B_1\}$
 - 2. Matches on B_2 for combination $\{A_1, B_2\}$
 - 3. Matches on B_3 for combination $\{A_1, B_3\}$
 - 4. Matches on B_4 for combination $\{A_1, B_4\}$

Pattern operators: every A -> every B

- Events
 - $A_1 B_1 C_1 B_2 A_2 D_1 A_3 B_3 E_1 A_4 F_1 B_4$
- Pattern
 - every A -> every B
- Results
 - The pattern fires for every A event followed by every B event.
 - 1. Matches on B_1 for combination $\{A_1, B_1\}$
 - 2. Matches on B_2 for combination $\{A_1, B_2\}$
 - 3. Matches on B_3 for combination $\{A_1, B_3\}$, $\{A_2, B_3\}$ and $\{A_3, B_3\}$
 - 4. Matches on B_4 for combination $\{A_1, B_4\}, \{A_2, B_4\}, \{A_3, B_4\}$ and $\{A_4, B_4\}$

Limiting sub-expression lifetime 1/3

- As the introduction of the every operator states, the operator starts new sub-expression instances and can cause multiple matches to occur for a single arriving event.
- New sub-expressions also take a very small amount of system resources and thereby your application should carefully consider when sub-expressions must end when designing patterns. Use the timer:within construct and the and not constructs to end active sub-expressions.
- Note: the data window onto a pattern stream does not serve to limit pattern sub-expression lifetime.

Limiting sub-expression lifetime 2/3

- Events
 - $\bullet A_1 A_2 B_1$
- Pattern
 - every A -> B
- Results
 - $\{A_1, B_1\}$ and $\{A_2, B_1\}$

- Events
 - $\bullet A_1 A_2 B_1$
- Pattern
 - every A -> (B and not A)
- Results
 - $\{A_2, B_1\}$
 - The and not operators cause the subexpression looking for {A₁, B?} to end when A₂ arrives.

Limiting sub-expression lifetime 3/3

- Events
 - A₁ received at t_o+ 1 sec
 - A₂ received at t_o+ 3 sec
 - B₁ received at t₀+ 4 sec
- Pattern
 - every A -> B
- Results
 - $\{A_1, B_1\}$ and $\{A_2, B_1\}$

- Events
 - A₁ received at t_o+ 1 sec
 - A₂ received at t₀+ 2 sec
 - B₁ received at t₀+ 3 sec
- Pattern
 - every A -> (B where timer:within(2 sec))
- Results
 - $\{A_2, B_1\}$
 - The where timer:within operators cause the sub-expression looking for {A₁, B?} to end after 2 seconds.

Combining Event Pattern Matching and Stream Analysis Example

Query

```
select count(a.sensor)
from pattern [every ( a = SmokeEventStream(smoke=true) ->
TemperatureEventStream(temperature>50, sensor=a.sensor)
where timer:within(4 sec) )].win:time(10 sec)
```

Execution trace

```
Sending Event: [S0|true|Mon Apr 29 15:18:10 CEST 2013]
Sending Event: [S0|64.0|Mon Apr 29 15:18:11 CEST 2013]
Event received: {count(*)=1}
Sending Event: [S1|true|Mon Apr 29 15:18:12 CEST 2013]
Sending Event: [S1|63.0|Mon Apr 29 15:18:13 CEST 2013]
Event received: {count(*)=2}
```

Event Pattern Matching and Stream Analysis in a graph Example

- The insert into clause forwards events to other streams for further downstream processing.
- Query cepConfig.addEventType("FireStream", FireComplexEvent.class.getName());

insert into FireStream

select a.sensor as sensor, a.smoke as smoke, b.temperature as temperature

from pattern [every (a = SmokeEventStream(smoke=true) -> b = TemperatureEventStream(temperature>5, sensor=a.sensor) where timer:within(2 sec))]

 Downstream query select count(*) from FireStream.win:time(10 sec)

Event Pattern Matching and Stream Analysis in a graph

Example: execution trace

```
Sending Event: [SO|false|Mon Apr 29 15:30:23 CEST 2013]
Sending Event: [S0|52.0|Mon Apr 29 15:30:24 CEST 2013]
Sending Event: [S1|true|Mon Apr 29 15:30:25 CEST 2013]
Sending Event: [S0 | 65.0 | Mon Apr 29 15:30:26 CEST 2013]
Sending Event: [SO | true | Mon Apr 29 15:30:27 CEST 2013]
Sending Event: [S0 | 65.0 | Mon Apr 29 15:30:28 CEST 2013]
Event received: Fire:[S0|true|65.0|Mon Apr 29 15:30:28 CEST 2013]
Event received: {count(*)=1}
Sending Event: [S0|true|Mon Apr 29 15:30:29 CEST 2013]
Sending Event: [S0|71.0|Mon Apr 29 15:30:30 CEST 2013]
Event received: Fire:[S0|true|71.0|Mon Apr 29 15:30:30 CEST 2013]
Event received: {count(*)=2}
Sending Event: [S0|true|Mon Apr 29 15:30:31 CEST 2013]
Sending Event: [S1|93.0|Mon Apr 29 15:30:32 CEST 2013]
Sending Event: [S1|true|Mon Apr 29 15:30:33 CEST 2013]
Sending Event: [S1 | 761.0 | Mon Apr 29 15:30:34 CEST 2013]
Event received: Fire:[S1|true|761.0|Mon Apr 29 15:30:34 CEST 2013]
Event received: {count(*)=3}
Event received: {count(*)=2}
Event received: {count(*)=1}
```

Resources

- Download Esper (for Java)
 - http://esper.codehaus.org/esper/download/download.html
- Download Nesper (for .net)
 - http://esper.codehaus.org/nesper/download/download.html
- Quick start
 - http://esper.codehaus.org/tutorials/tutorial/quickstart.htm
- Tutorial
 - http://esper.codehaus.org/tutorials/tutorial/tutorial.html
- Questions on EPL
 - http://esper.codehaus.org/tutorials/solution patterns/solution patterns.html
- Documentation
 - http://esper.codehaus.org/esper/documentation/documentation.html
- A not-trivial example: DEBS 2011 Challenge
 - http://esper.codehaus.org/tutorials/tutorial/debs2011 challenge.html

Acknowledges

- Large part of the content of are taken from
 - EsperTech: "Event Stream Intelligence Continuous Event Processing for the Right Time Enterprise Products Data Sheet"
 - EsperTech: "Reference Documentation Version:
 4.2.0"