

# Temporal Event Analytics with EventFlow: A Case Study of the Response to Fatal Incidents Baltimore Region, 2014 – 2016

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# Overview

- What is Eventflow?
- Case study using state fatal crash data for Baltimore region from 2014 to 2016:  
What can we learn from the visualizations?
- Observations



# What is Eventflow?





# EventFlow: Visual Analysis of Temporal Event Sequences

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**EventFlow v2.3.4**  
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Show all records | Select visibles | Hide selected | Deselect all | Hide others  
18 records | 18 visibles | 0 selected

Choose 2 | Align | Merge | Window

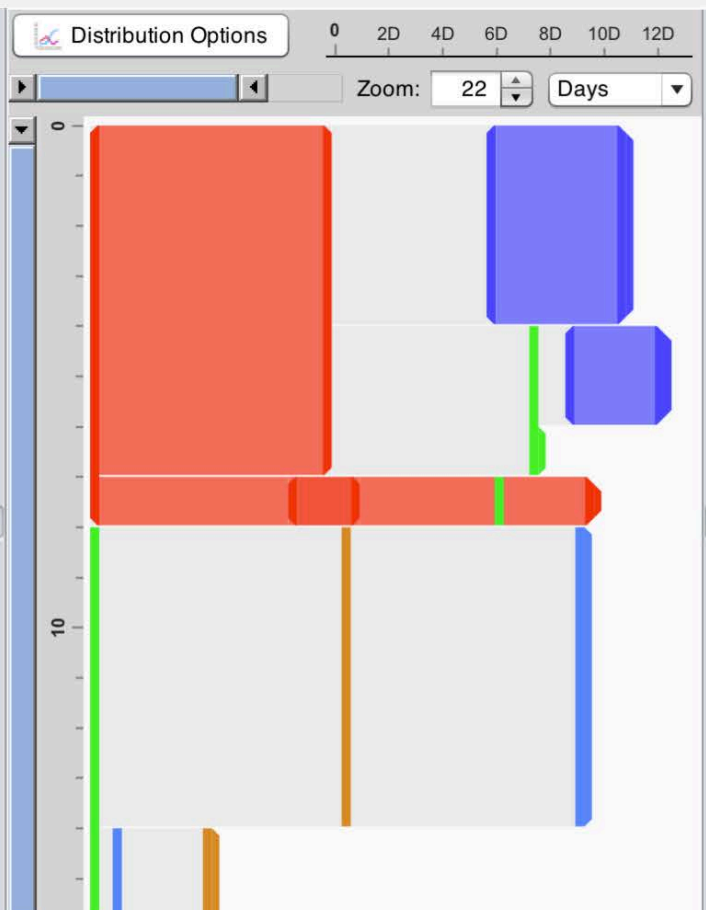
To simplify the overview, try looking at only 2 event categories.

**We suggest:**  
 ■ Drug A (11 Records)  
 ▲ Stroke (12 Records)  
 (Covers 18 of 18 records):

**based on this selection method:**  
 Maximize Dataset Coverage

More Choices | Choose 2

- ▲ Admitted 8
- ▲ Diagnosed 10
- Drug A 11
- Drug B 8



Timeline | Category Hierarchy

Simple Search | Advanced Search

Occur | Does not occur

Clear | Replace As... | Search

**Matching** 6 records (0 selected) Selection: [Add All](#) | [Remove All](#)

1 Jan 2011 0:00 | 30 Jan 2011 0:00

Record ID	Event 1	Event 2
0	Drug A	Drug B
1	Drug A	Drug B
5	Drug A	Drug B
10	Drug A	Drug B
11	Drug A	Drug B

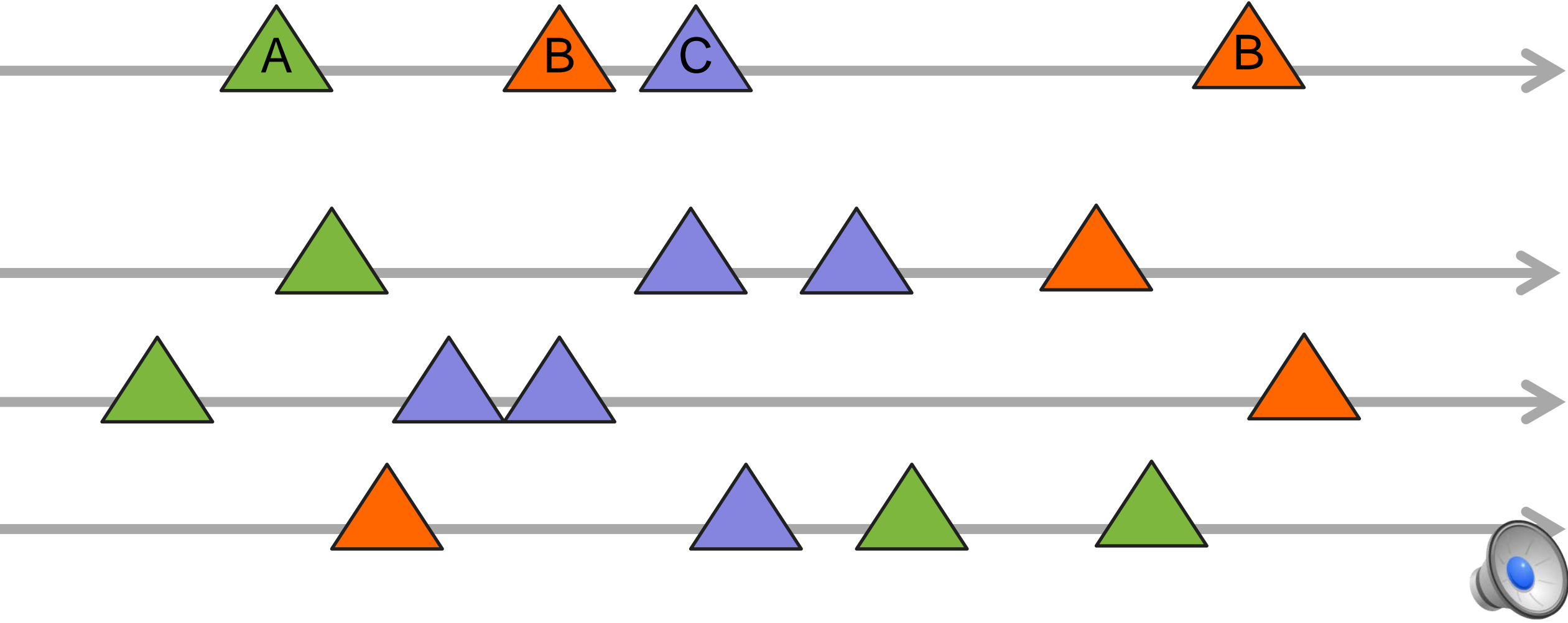
**Non-Matching** 12 records (0 selected) Selection: [Add All](#) | [Remove All](#)

1 Jan 2011 0:00 | 30 Jan 2011 0:00

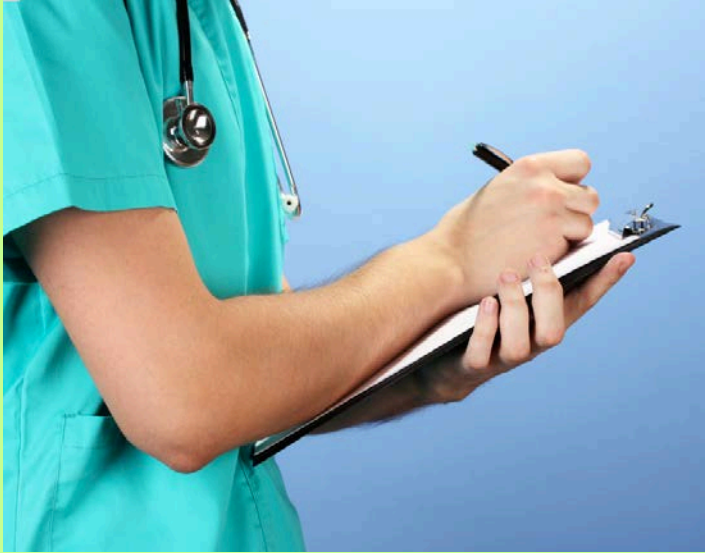
Record ID	Event 1	Event 2
2	Stroke	Diagnosed



# Event Analytics



# Many application domains



**Electronic Health Records:** symptoms, treatment, lab test

**Student records:** course, paper, proposal, defense, etc.

**Web logs,** usability logs, security etc.

**Traffic incident logs:** confirmed, unit arrived, lane closed etc



# Visualize a single accident

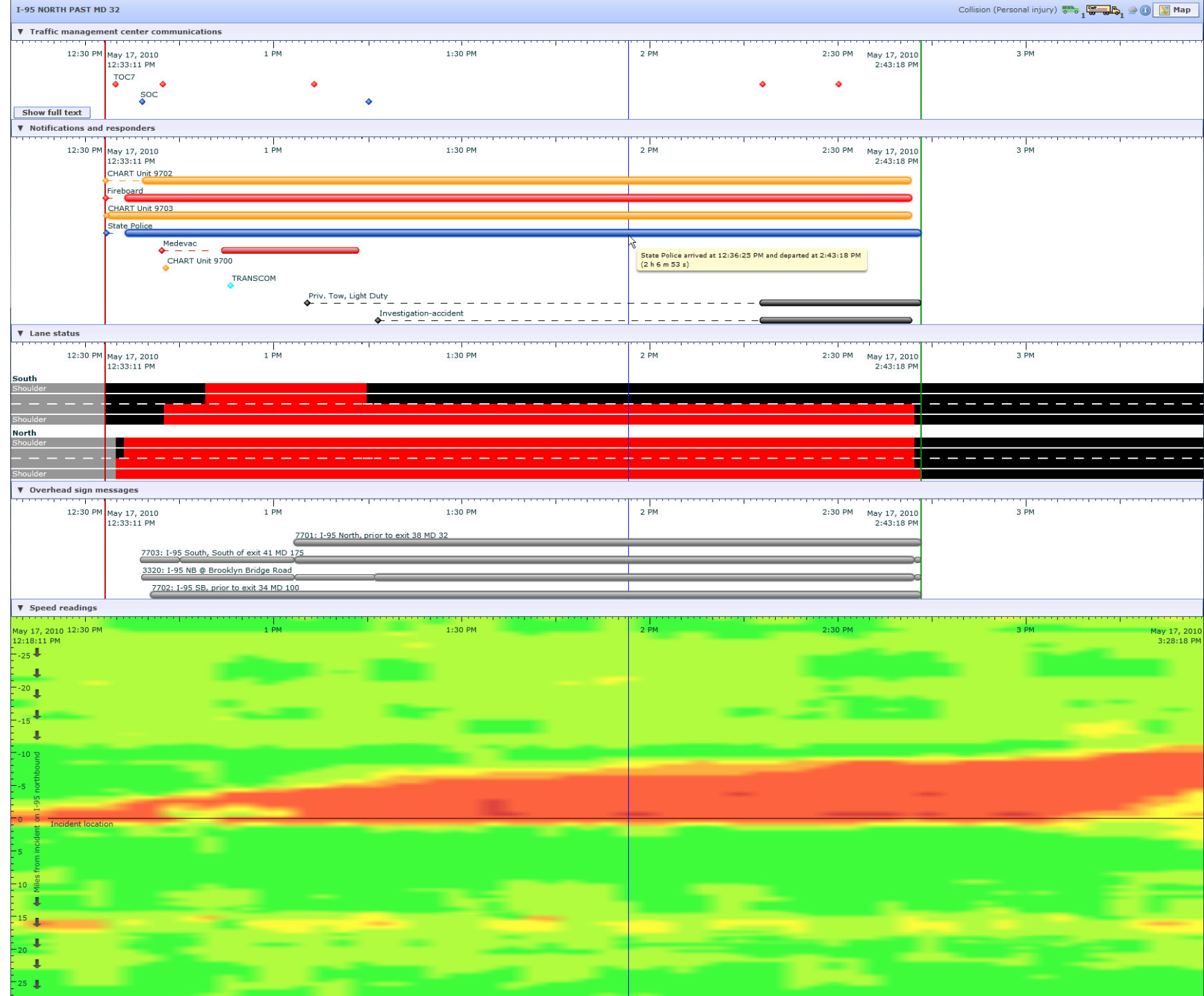
Communications

Notifications and responders

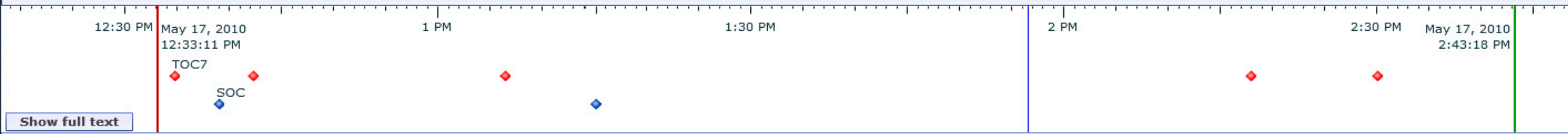
Lane status

Overhead message signs

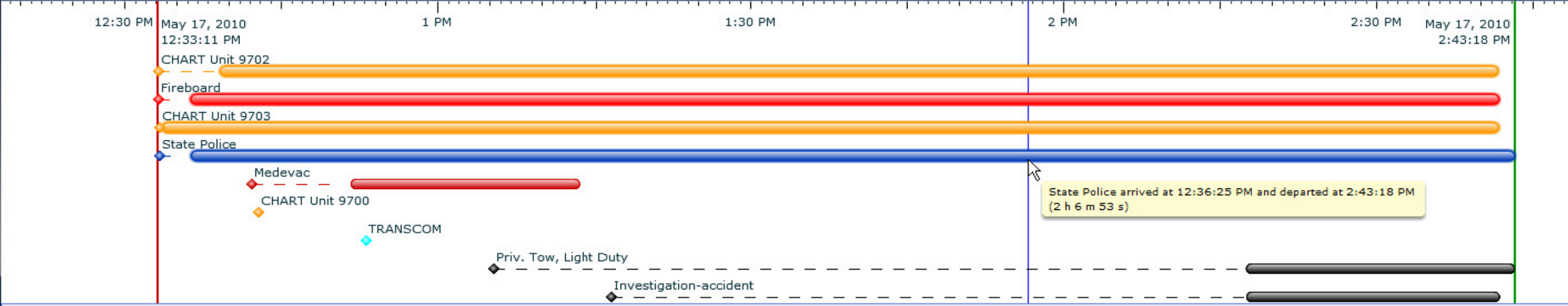
Speed readings



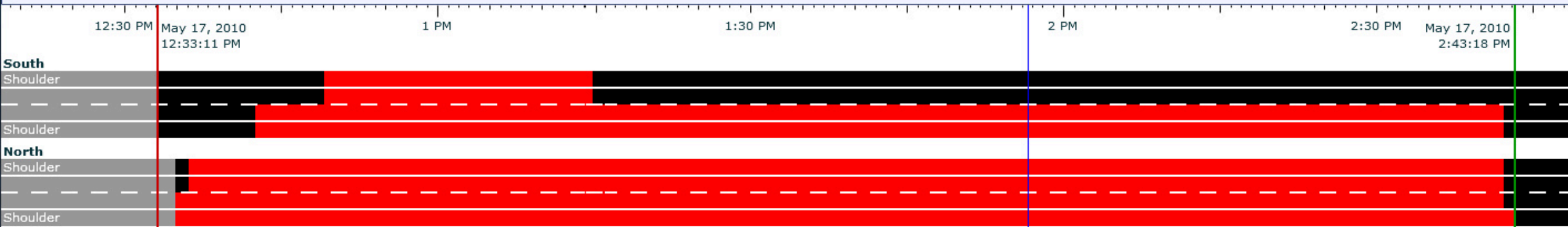
▼ Traffic management center communications



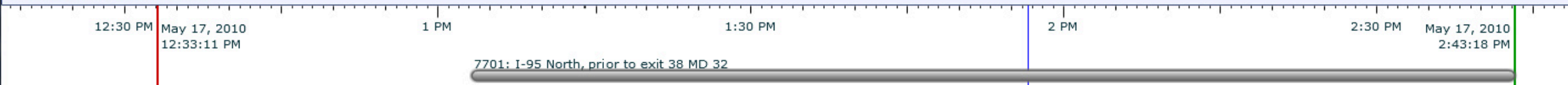
▼ Notifications and responders



▼ Lane status



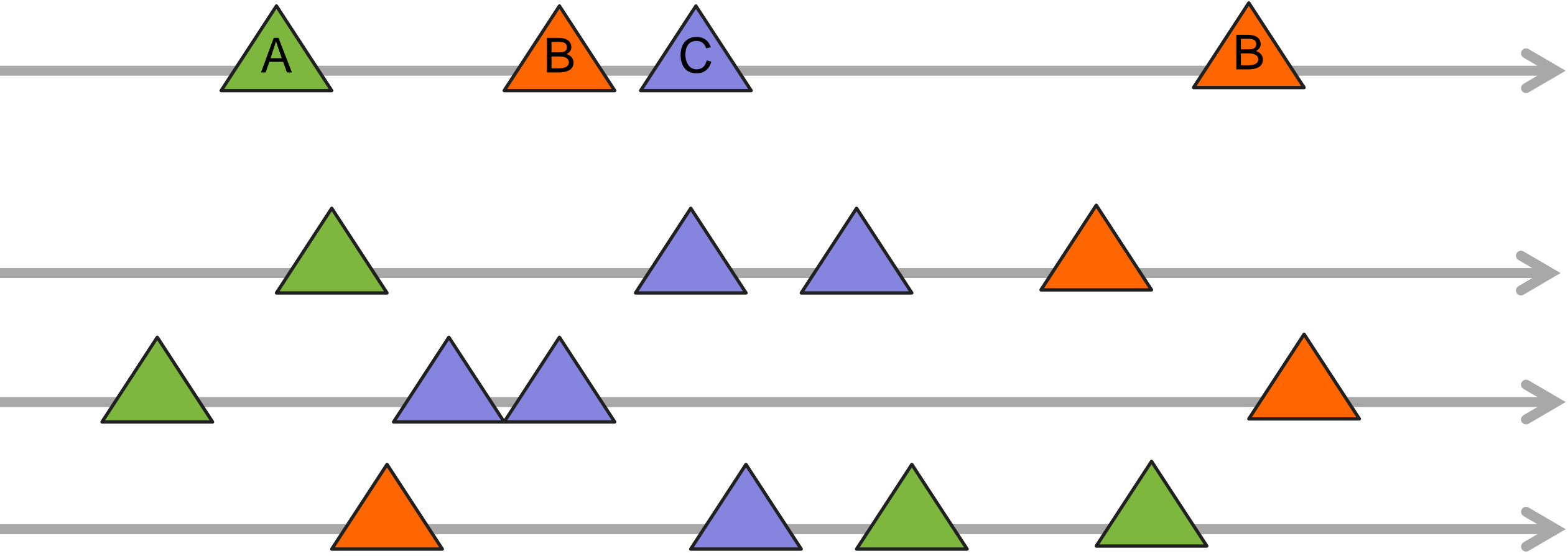
▼ Overhead sign messages





How to analyze  
temporal patterns  
in a **set of incidents**  
?

# Event Analytics



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Show all records  
   
   
**22 records**   **22 visibles**   **0 selected**

No alignment  
 1 st

Focus:   
 Before   Both   After  
 (no advanced option selected)

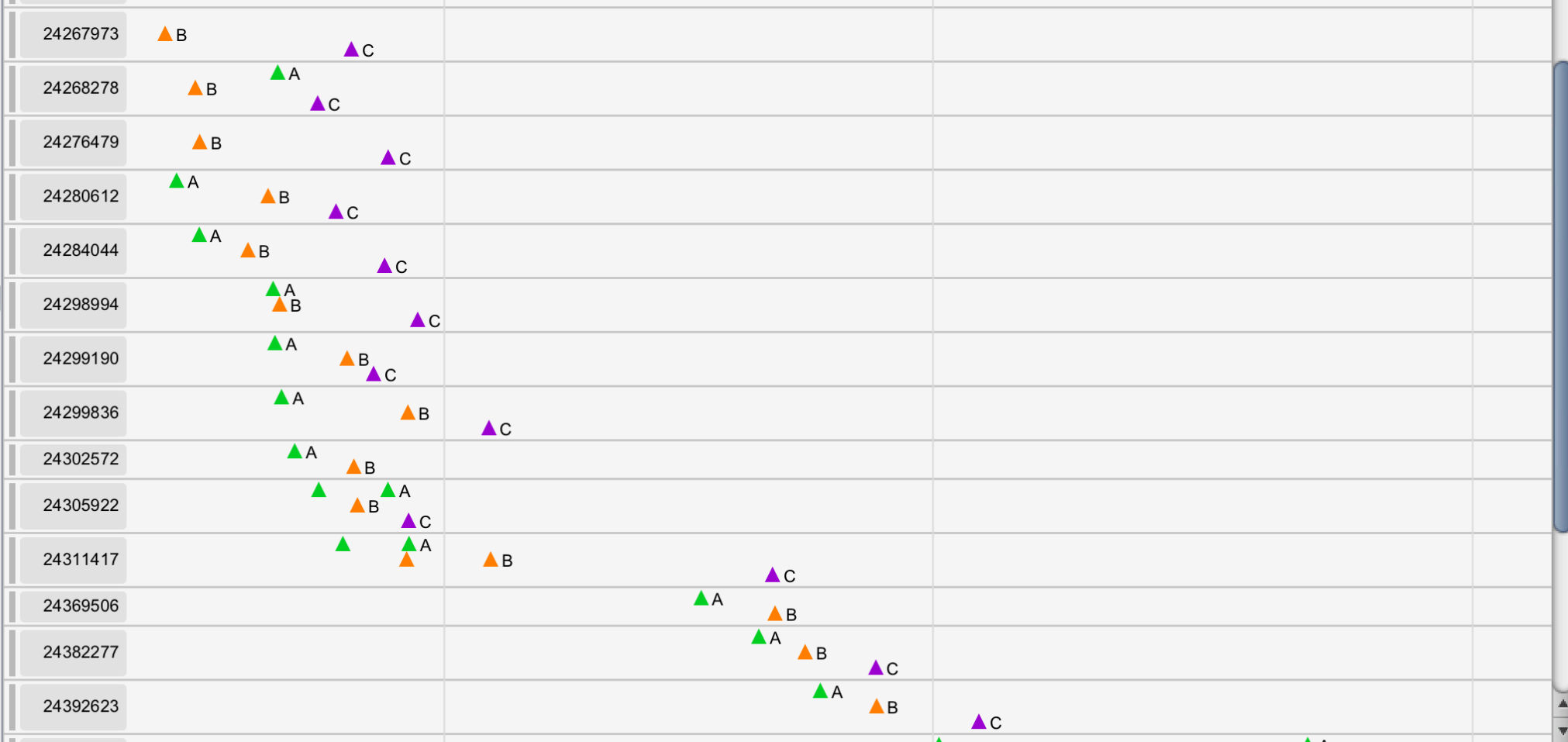
automatic update  

- ▲ A      29
- ▲ B      25
- ▲ C      19

Select All  
  Deselect All

**Timeline**   **Category Hierarchy**   **Simple Search**   **Advanced Search**

22 records (0 selected)      Selection: [Add All](#) | [Remove All](#)  
 15 Jan 2010 13:17      4 Apr 2010 15:18



EventFlow v2.3.4  
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Show all records  
22 records

Select visibles  
22 visibles

Hide selected  
0 selected

Deselect all

Hide others

**RECORD** [X]

ID

24280612 [copy]

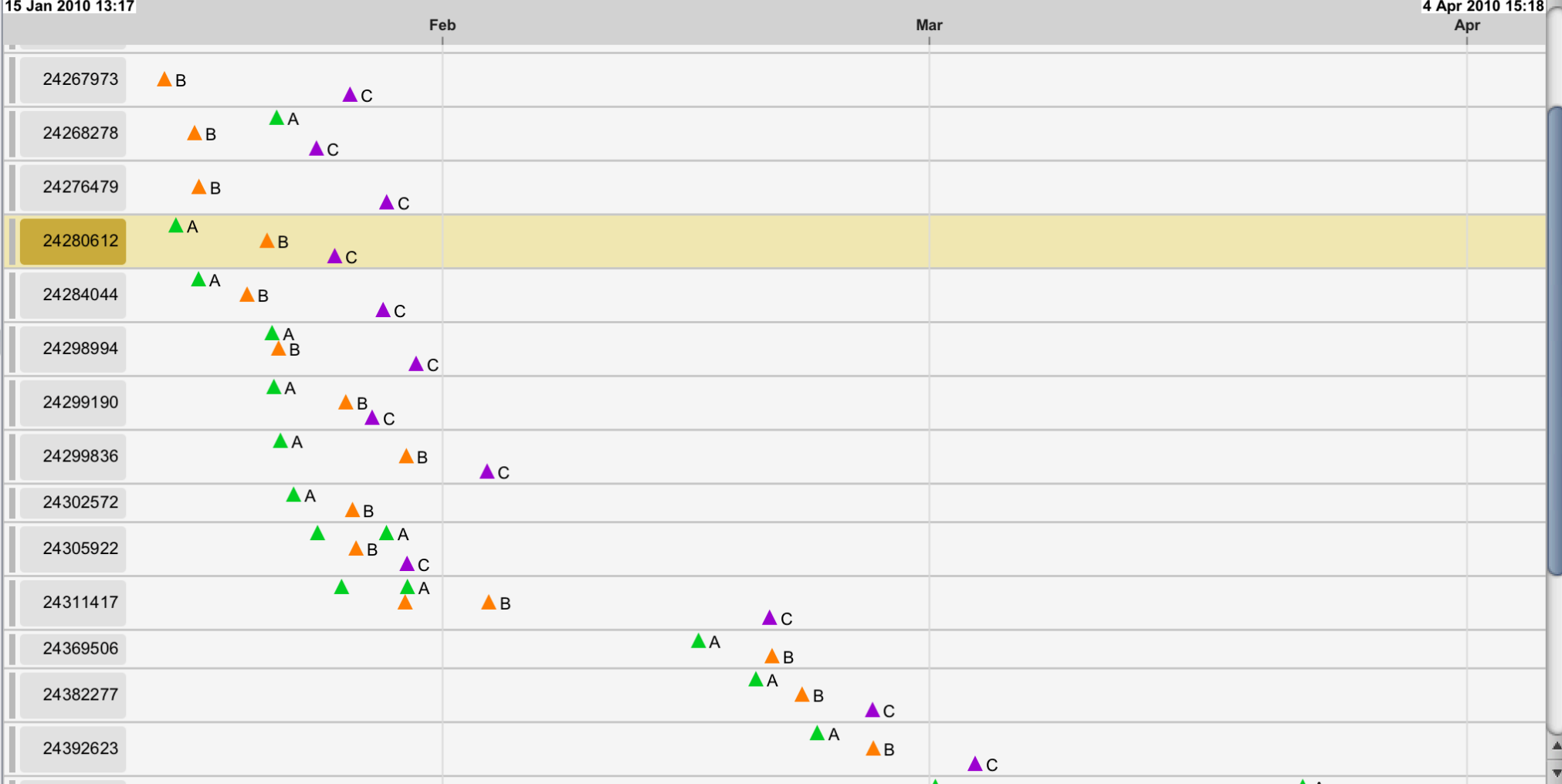
Press 'F2' to freeze tooltip.

- ▲ A 29
- ▲ B 25
- ▲ C 19

Select All  
 Deselect All

Timeline Category Hierarchy Simple Search Advanced Search

22 records (0 selected) Selection: [Add All](#) | [Remove All](#)



**EventFlow v2.3.4**  
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Show all records | Select visibles | Hide selected  
Deselect all | Hide others  
22 records | 22 visibles | 0 selected  
Choose 2 | Align | Merge | Window

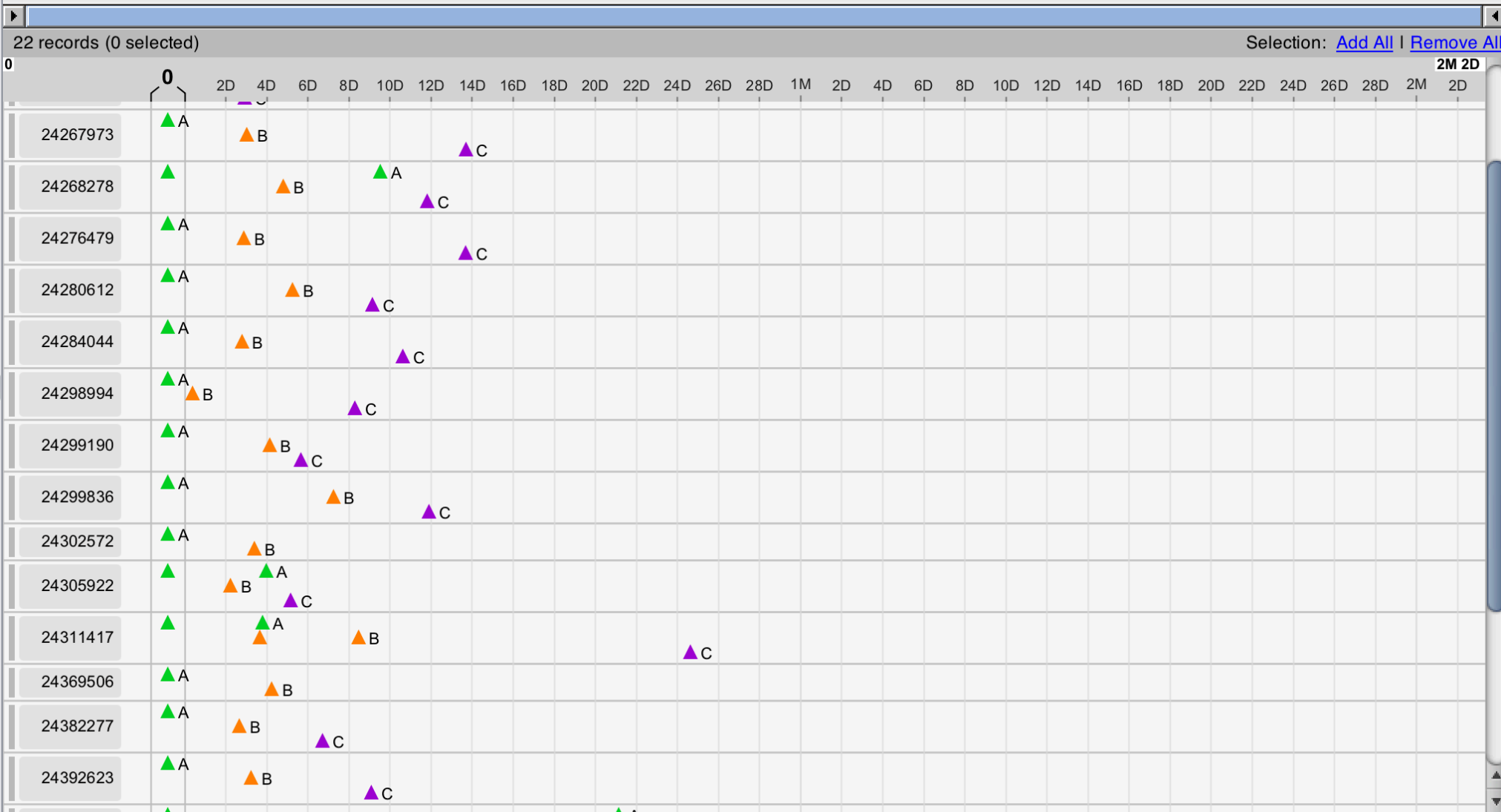
No alignment  
 1 st ▲ A  
from the beginning

Focus:  Before  Both  After  
(no advanced option selected)  
 automatic update **Align**

- ▲ A 29
- ▲ B 25
- ▲ C 19

- Select All
- Deselect All

**Timeline** | Category Hierarchy | Simple Search | Advanced Search



All records aligned event A

EventFlow v2.3.4 - AAAsample\_GENERIC.txt (AAAsample\_GENERIC.txt)

File Dataset Selection View Help

**EventFlow v2.3.4**  
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Show all records | Select visibles | Hide selected | Deselect all | Hide others  
 22 records | 22 visibles | 0 selected

Choose 2 | Align | Merge | Window

No alignment  
 1 st ▲ A  
 from the beginning

**Focus:** Before | Both | After  
 (no advanced option selected)

automatic update **Align**

▲ A 29  
 ▲ B 25  
 ▲ C 19

Select All  
 Deselect All

Distribution Options | 0 2D 4D 6D 8D 10D 12D | Zoom: 1 | Months

**Timeline** | Category Hierarchy | Simple Search | Advanced Search

22 records (0 selected) | Selection: [Add All](#) | [Remove All](#)

Record ID	Category A (▲ A)	Category B (▲ B)	Category C (▲ C)
24169815			
24236549	▲ A	▲ B	▲ C
24257404	▲ A	▲ B	▲ C
24267973	▲ A	▲ B	▲ C
24268278	▲ A	▲ B	▲ C
24276479	▲ A	▲ B	▲ C
24280612	▲ A	▲ B	▲ C
24284044	▲ A	▲ B	▲ C
24298994	▲ A	▲ B	▲ C
24299190	▲ A	▲ B	▲ C
24299836	▲ A	▲ B	▲ C
24302572	▲ A	▲ B	
24305922	▲ A	▲ B	▲ C
24311417	▲ A	▲ B	▲ C
24369506	▲ A	▲ B	

overview of all sequences

EventFlow v2.3.4  
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Show all records  
22 records 22 visibles 12 selected

Choose 2 Align Merge Window

No alignment  
1 st A  
from the beginning

Focus: Before Both After  
(no advanced option selected)  
automatic update Align

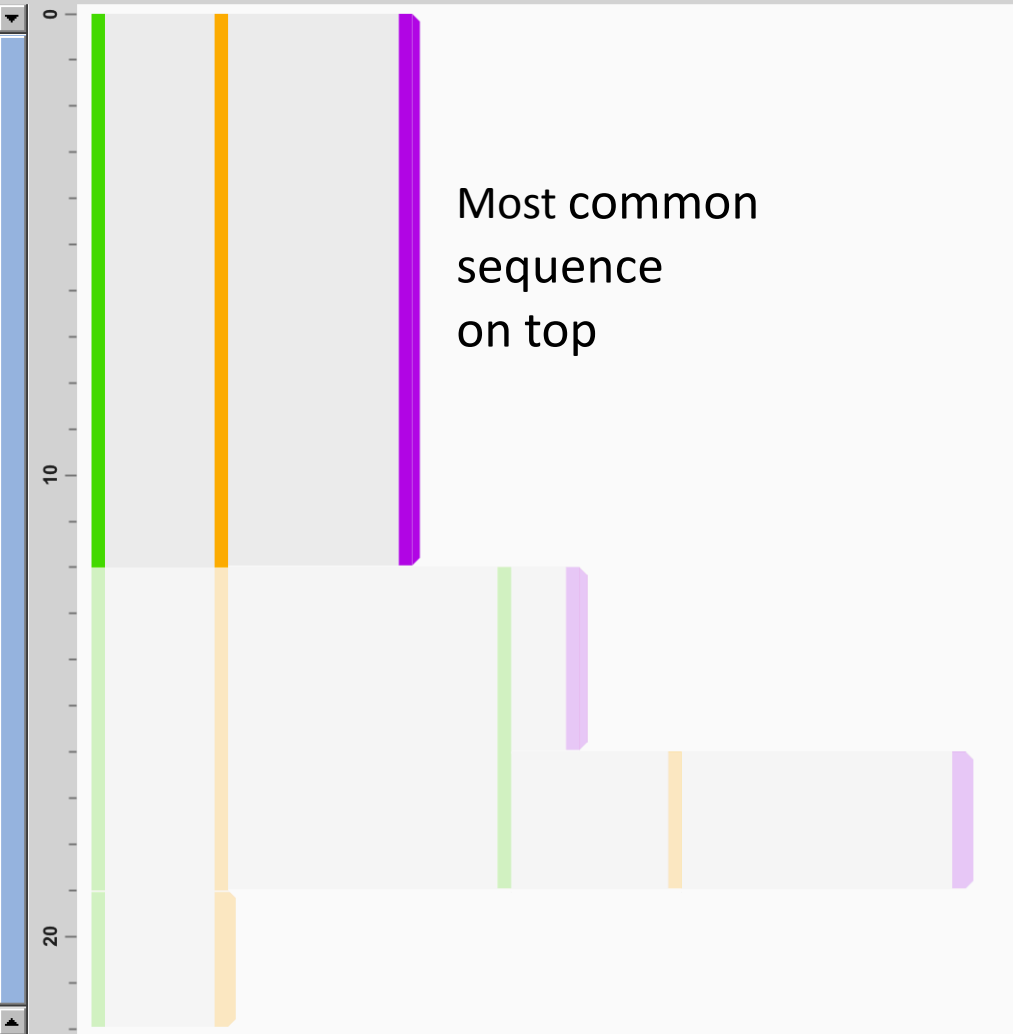
A 29  
B 25  
C 19

Select All  
Deselect All

Distribution Options

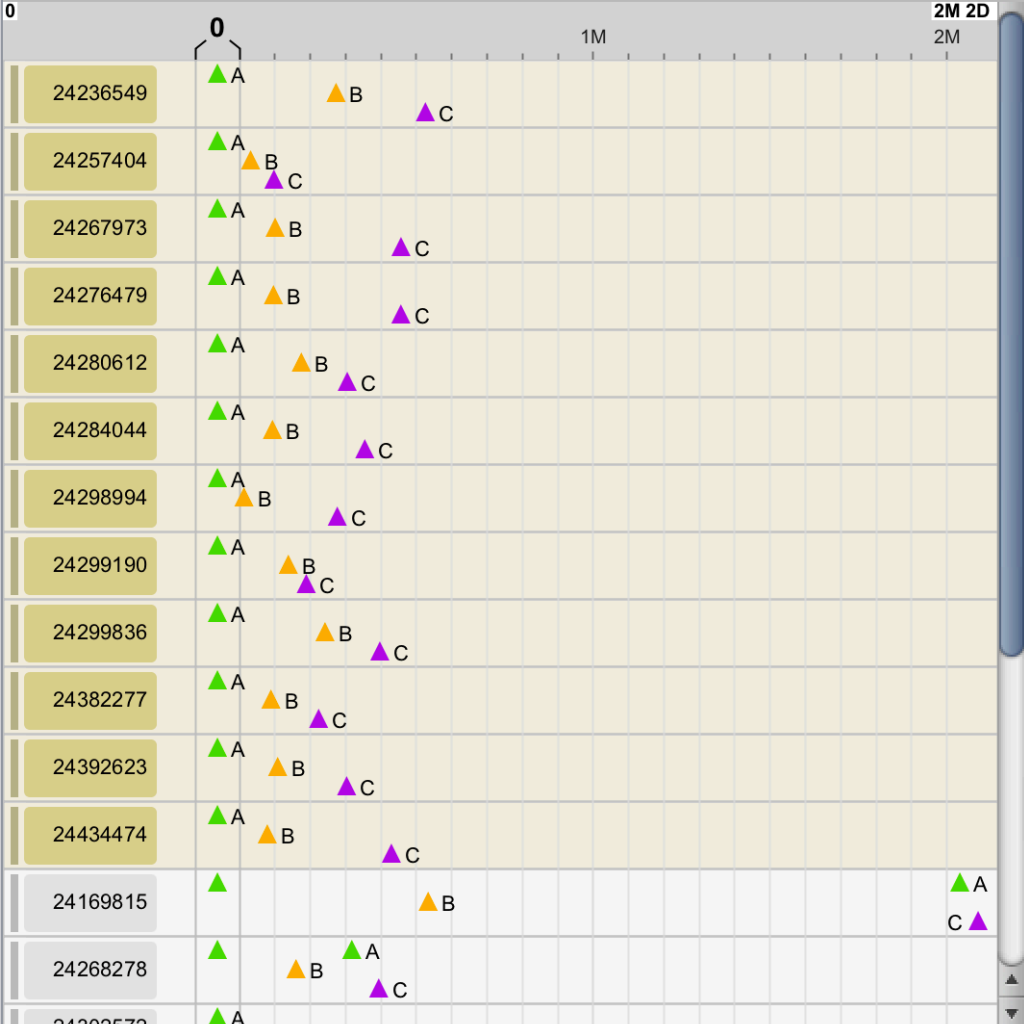
0 2D 4D 6D 8D 10D 12D

Zoom: 1 Months



Timeline Category Hierarchy Simple Search Advanced Search

22 records (12 selected) Selection: Add All Remove All



**EventFlow v2.3.4**  
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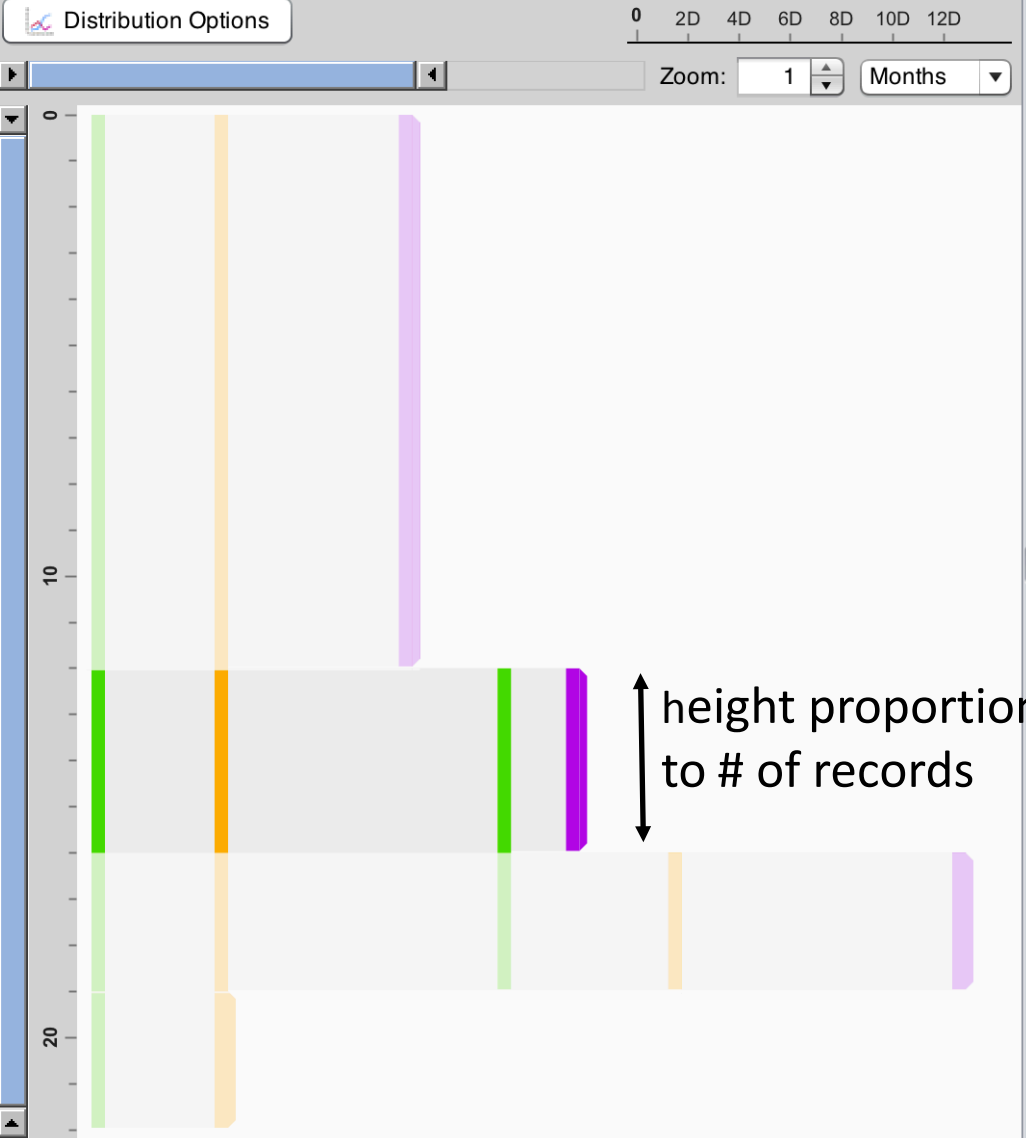
Show all records  
Select visibles Hide selected  
Deselect all Hide others  
22 records 22 visibles 4 selected  
Choose 2 Align Merge Window

No alignment  
1 st **A**  
from the beginning

Focus: Before Both After  
(no advanced option selected)  
 automatic update **Align**

- A** 29
- B** 25
- C** 19

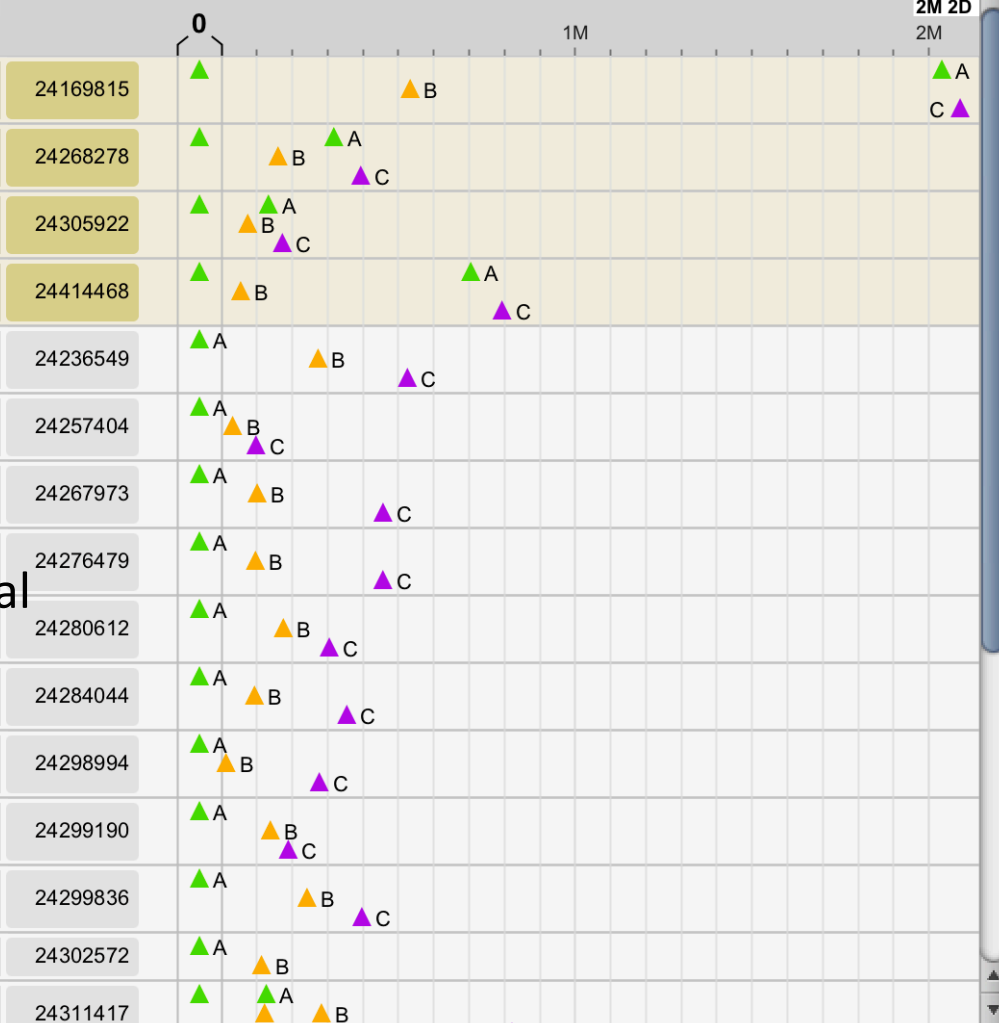
Select All  
 Deselect All



height proportional to # of records

Timeline Category Hierarchy Simple Search Advanced Search

22 records (4 selected) Selection: [Add All](#) | [Remove All](#)





**EventFlow v2.3.4**  
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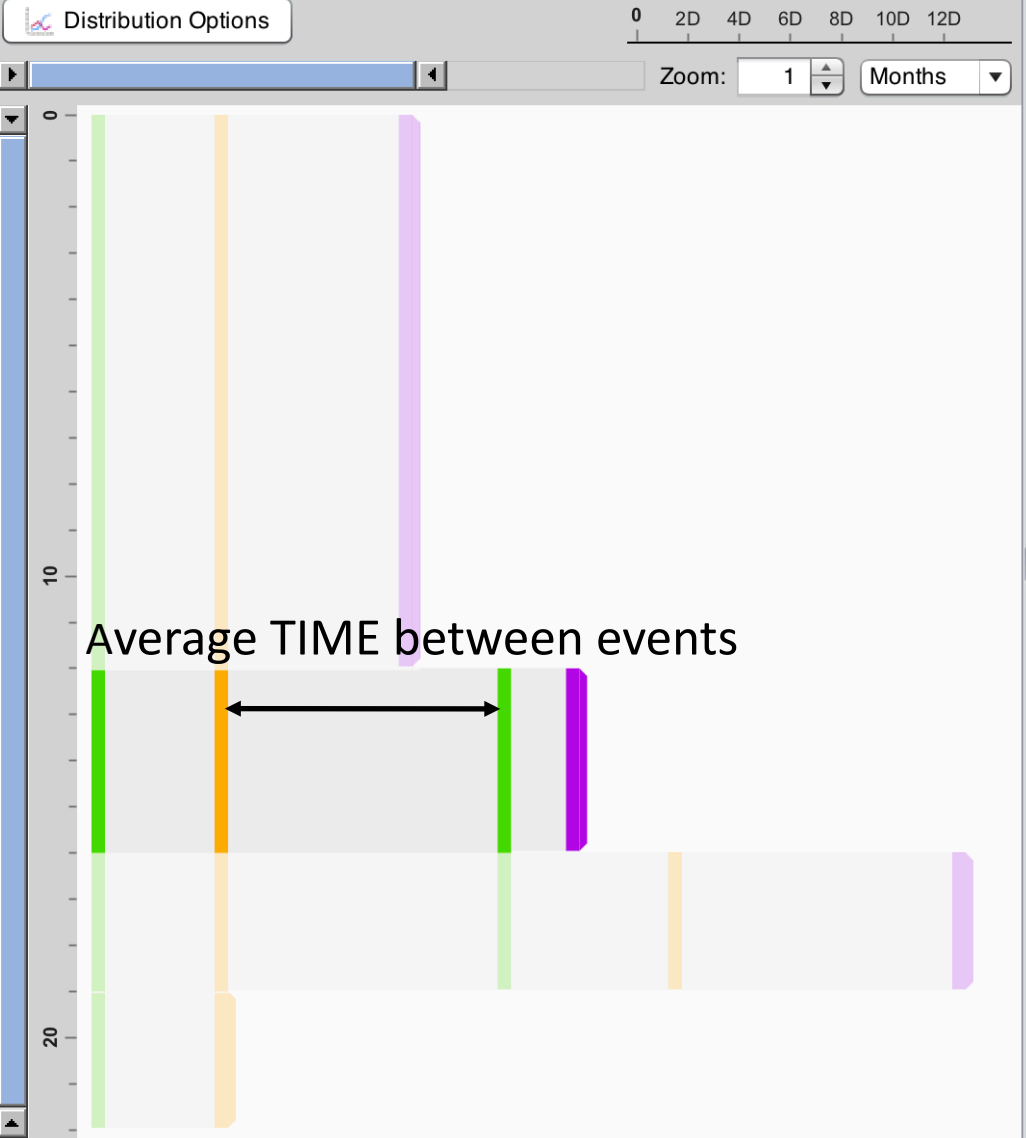
Show all records  
Select visibles Hide selected  
Deselect all Hide others  
22 records 22 visibles 4 selected  
Choose 2 Align Merge Window

No alignment  
1 st ▲ A  
from the beginning

Focus: Before Both After  
(no advanced option selected)  
 automatic update **Align**

- ▲ A 29
- ▲ B 25
- ▲ C 19

Select All  
 Deselect All



Timeline Category Hierarchy Simple Search Advanced Search

22 records (4 selected) Selection: [Add All](#) | [Remove All](#)

Record ID	Category A (▲)	Category B (▲)	Category C (▲)
24169815	Yes	Yes	Yes
24268278	Yes	Yes	Yes
24305922	Yes	Yes	Yes
24414468	Yes	Yes	Yes
24236549	Yes	Yes	Yes
24257404	Yes	Yes	Yes
24267973	Yes	Yes	Yes
24276479	Yes	Yes	Yes
24280612	Yes	Yes	Yes
24284044	Yes	Yes	Yes
24298994	Yes	Yes	Yes
24299190	Yes	Yes	Yes
24299836	Yes	Yes	Yes
24302572	Yes	Yes	Yes
24311417	Yes	Yes	Yes

**EventFlow v2.3.4**  
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Show all records | Select visibles | Hide selected  
Deselect all | Hide others

22 records | 22 visibles | 0 selected

**22 RECORDS** (Close icon)

100% of all records  
100% of visible records  
0/22 selected

- 0. A

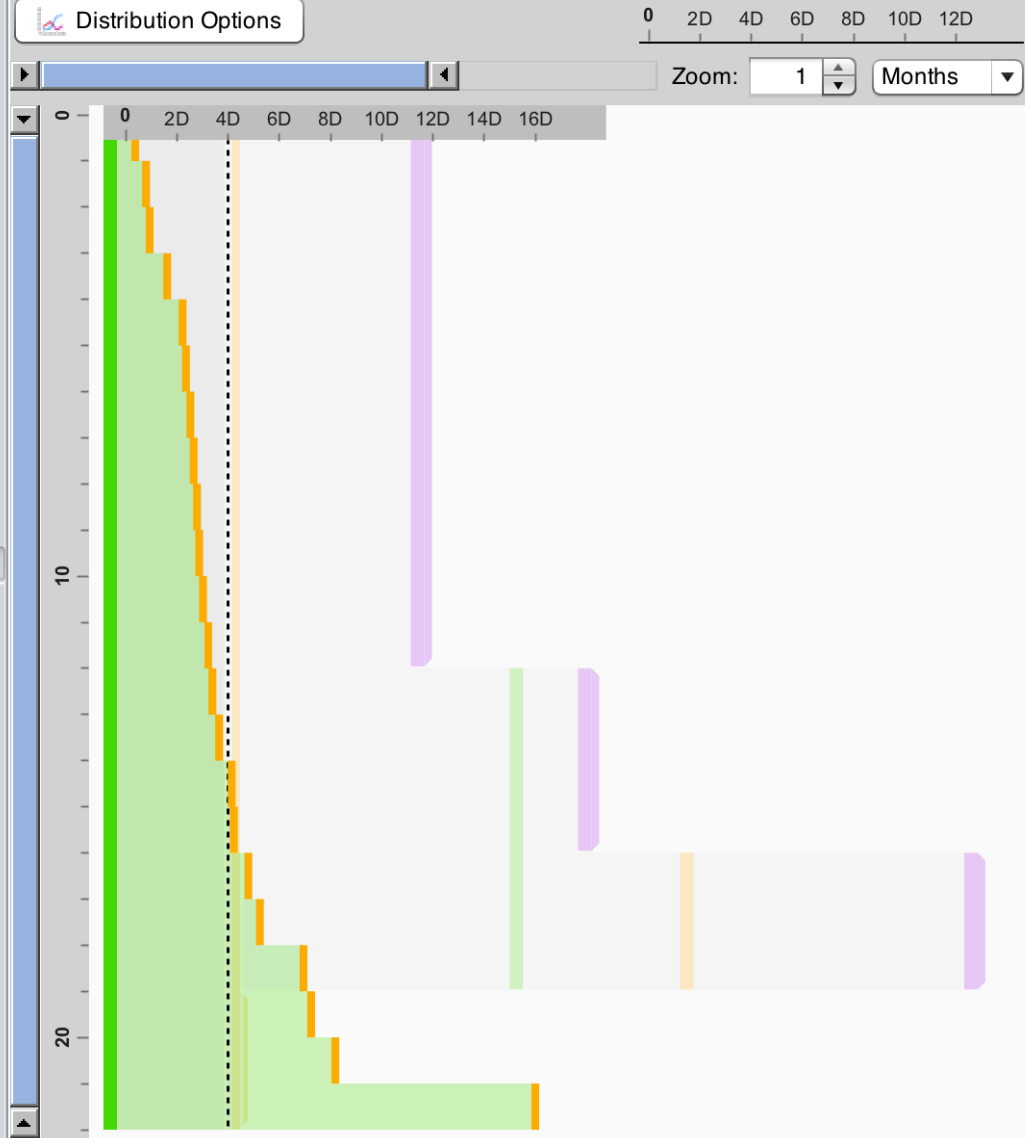
Mean: 4 days 1:21 hrs 40 s  
Median: 3 days 2:59 hrs  
SD: 3 days 8:26 hrs 21 s

- 1. B

Press 'F2' to freeze tooltip.  
Press 'F4' to copy tooltip.

- ▲ A 29
- ▲ B 25
- ▲ C 19

Select All  
 Deselect All



Timeline | Category Hierarchy | Simple Search | Advanced Search

22 records (0 selected) Selection: [Add All](#) | [Remove All](#)

Record ID	Category A (▲)	Category B (▲)	Category C (▲)
24169815	0	B	A, C
24236549	A	B	C
24257404	A, B, C		
24267973	A	B	C
24268278	A	B	A, C
24276479	A	B	C
24280612	A	B	C
24284044	A	B	C
24298994	A	B	C
24299190	A	B, C	
24299836	A	B	C
24302572	A	B	
24305922	A, B, C		
24311417	A	B	C
24369506	A	B	

Show distribution of time between events

# Graphical search with temporal constraint

EventFlow v2.3.4 - AAAsample\_GENERIC.txt (AAAsample\_GENERIC.txt)

File Dataset Selection View Help

**EventFlow v2.3.4**  
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Show all records | Select visibles | Hide selected | Deselect all | Hide others  
22 records | 22 visibles | 0 selected

Choose 2 | Align | Merge | Window

No alignment

1 st  A  
from the beginning

**Focus:** Before | Both | After  
(no advanced option selected)

automatic update **Align**

<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	▲ A	29
<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	▲ B	25
<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	▲ C	19

Select All  
 Deselect All

Distribution Options

0 2D 4D 6D 8D 10D 12D  
Zoom: 1 Months

**Timeline** | Category Hierarchy | Simple Search | Advanced Search

Time Lapse <= 2 hours

Occur  
Does not occur

Clear | Replace As... | Search

**Matching 4 records (0 selected)** Selection: [Add All](#) | [Remove All](#)

Record ID	Event A (Green)	Event B (Orange)	Event C (Purple)
24305922	0	0.5	1
24311417	0	0.5	1.5
24436446	0	0.5	1.5
24504342	0	0.5	1

**Non-Matching 18 records (0 selected)** Selection: [Add All](#) | [Remove All](#)

Record ID	Event A (Green)	Event B (Orange)	Event C (Purple)
24169815	0	1.5	2.5
24236549	0	1	1.5
24257404	0	0.5	1

**EventFlow v2.3.4**  
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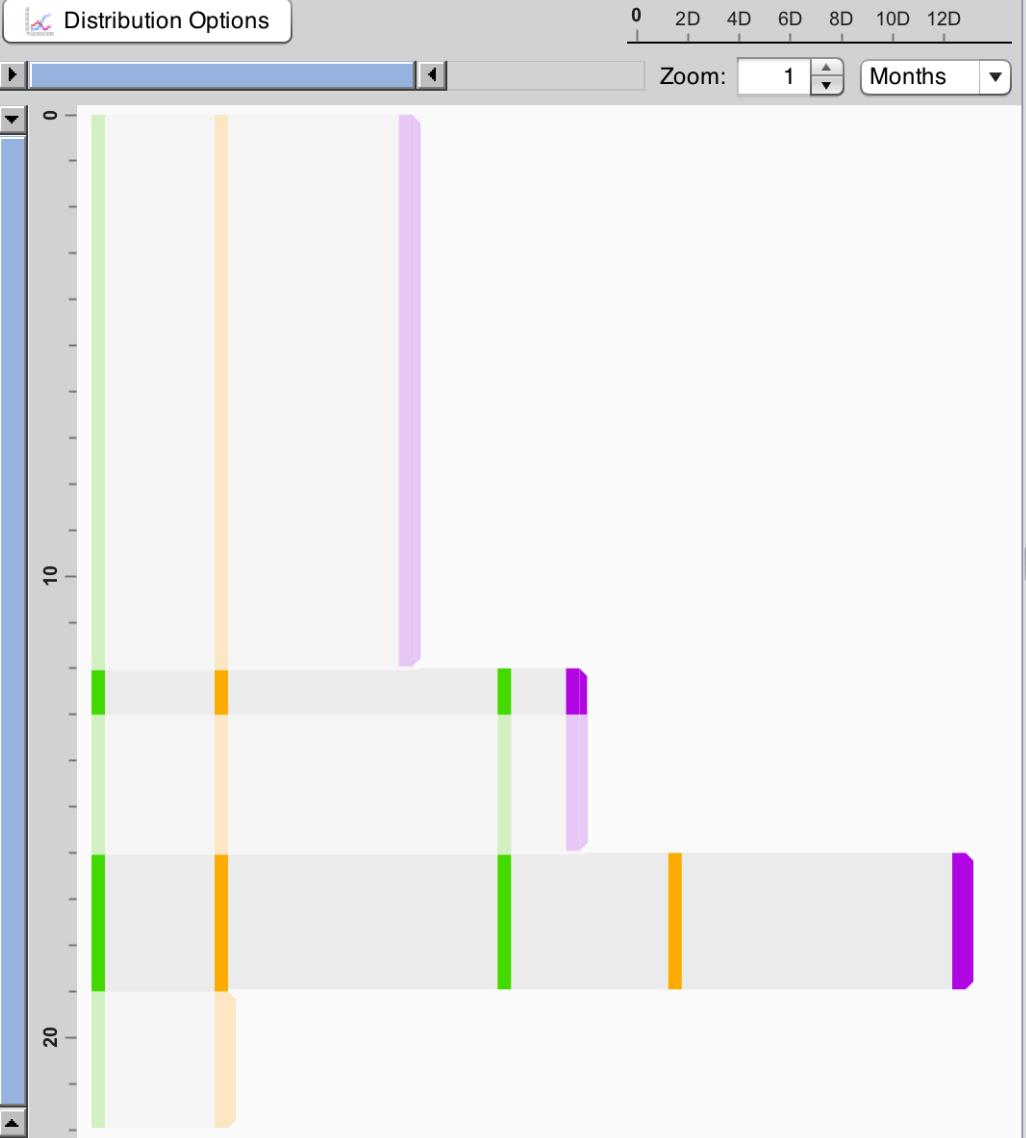
Show all records  
   
   
**22 records**   **22 visibles**   **4 selected**

No alignment  
 1 st ▲ A  
 from the beginning

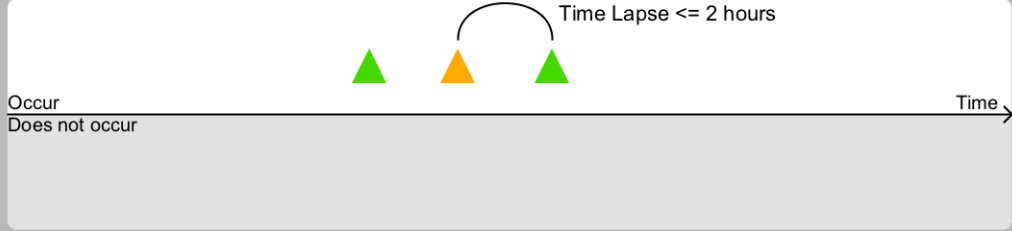
**Focus:**   
 Before   Both   After  
 (no advanced option selected)  
 automatic update  

- ▲ A      29
- ▲ B      25
- ▲ C      19

Select All  
 Deselect All

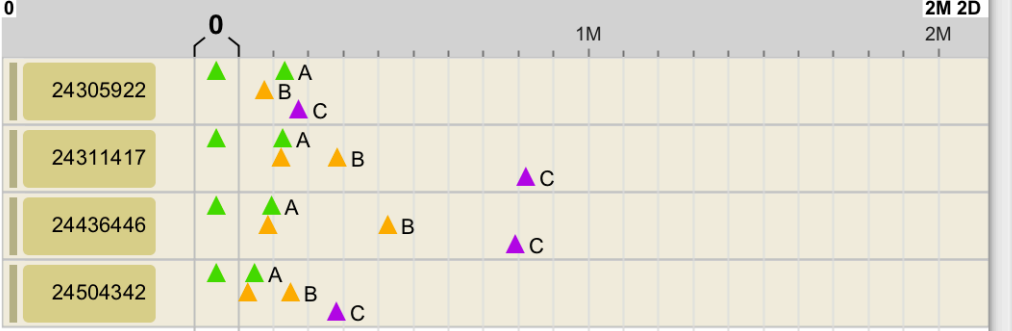


**Timeline**   **Category Hierarchy**   **Simple Search**   **Advanced Search**

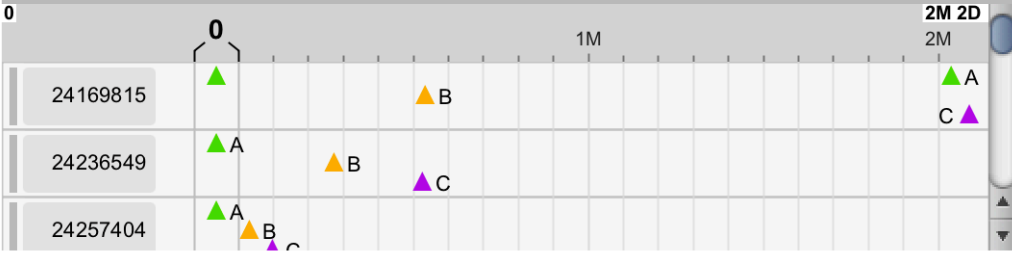


**Matching** 4 records (4 selected)   Selection: [Add All](#) | [Remove All](#)



**Non-Matching** 18 records (0 selected)   Selection: [Add All](#) | [Remove All](#)





# EventFlow: Visual Analysis of Temporal Event Sequences

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The screenshot displays the EventFlow v2.3.4 interface. On the left, a sidebar contains controls for record visibility (18 records, 18 visible, 0 selected) and a list of suggested event categories: Drug A (11 records, red square) and Stroke (12 records, green triangle). The main visualization area shows a timeline with a zoom of 22 days. A large red block represents Drug A, and a blue block represents Stroke. A horizontal bar at the bottom shows the overlap of these events. On the right, a 'Timeline' panel shows a 'Simple Search' view with two horizontal bars (red and blue) representing the duration of Drug A and Stroke respectively. Below this, a table shows 'Matching 6 records (0 selected)' with columns for date, year, and event categories.

Date	Year	Event Categories
1 Jan 2011 0:00	2011	Drug A, Drug B
1		Drug A, Drug B

<http://hcil.umd.edu/eventflow/>  
Questions: [plaisant@cs.umd.edu](mailto:plaisant@cs.umd.edu)

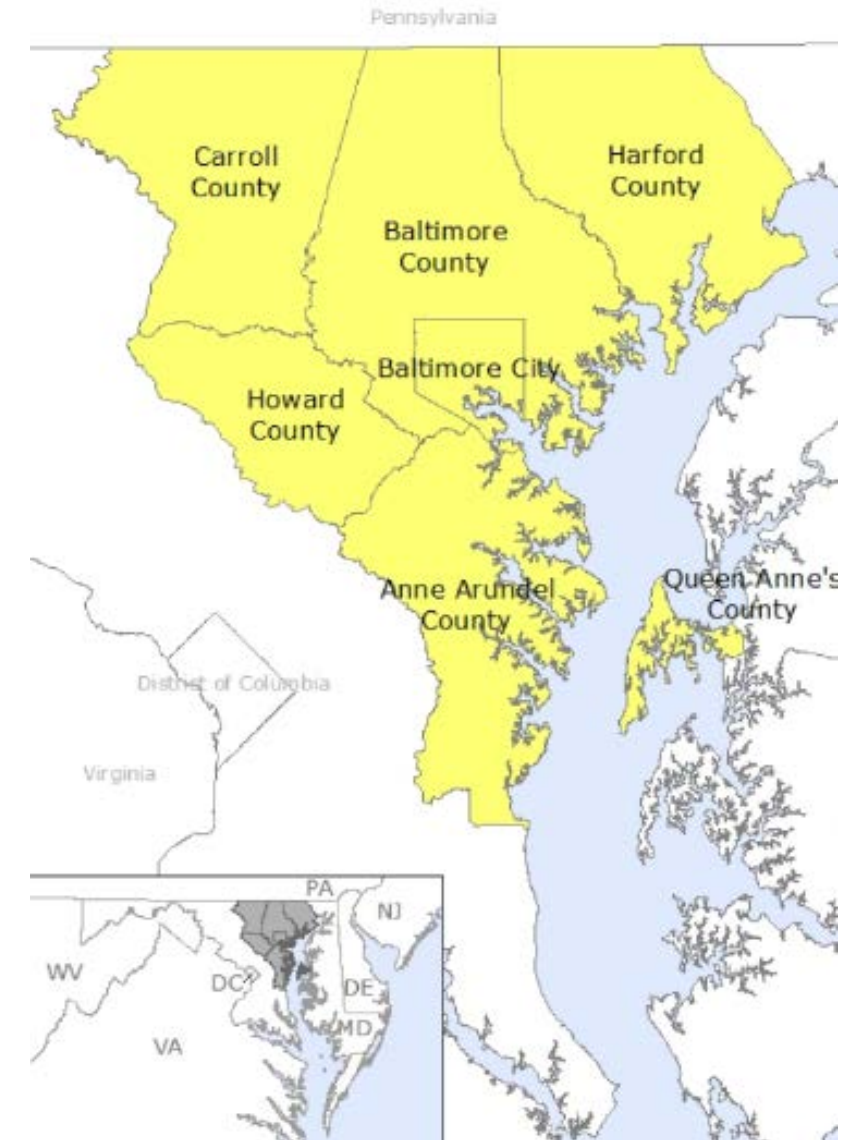
# Case Study: Fatal Crash Data for Baltimore Region, 2014 - 2016

- Baltimore Region Traffic Incident Management Committee investigating ways to decrease incident clearance time
- Why start with fatal crashes?
  - longest average clearance time
  - Involve more responders
- Starting in 2014, data entry into State traffic management (CHART) system became much more uniform, therefore easier to analyze without first cleaning

# Fatal Crash Data for Baltimore Region

- 219 fatal crashes for 2014 – 2016
- Only records from State CHART system
- Most Baltimore City crash records not in state system
  - City maintains most of its roads

	2014	2015	2016
<b>Baltimore City</b>	2	2	5
<b>Anne Arundel Co</b>	22	19	25
<b>Baltimore Co</b>	16	25	23
<b>Carroll Co</b>	5	9	6
<b>Harford Co</b>	11	15	10
<b>Howard Co</b>	4	9	11
<b>TOTAL</b>	60	79	80



Note: data for Queen Anne's Co was not included

# Responder Categories That Most Impact Fatal Crash Clearance Time

- Investigation-accident (Police Crash Team)
- Medical Examiner
- Private Tow
  - Heavy Duty
  - Light Duty

Case study focused  
on these categories

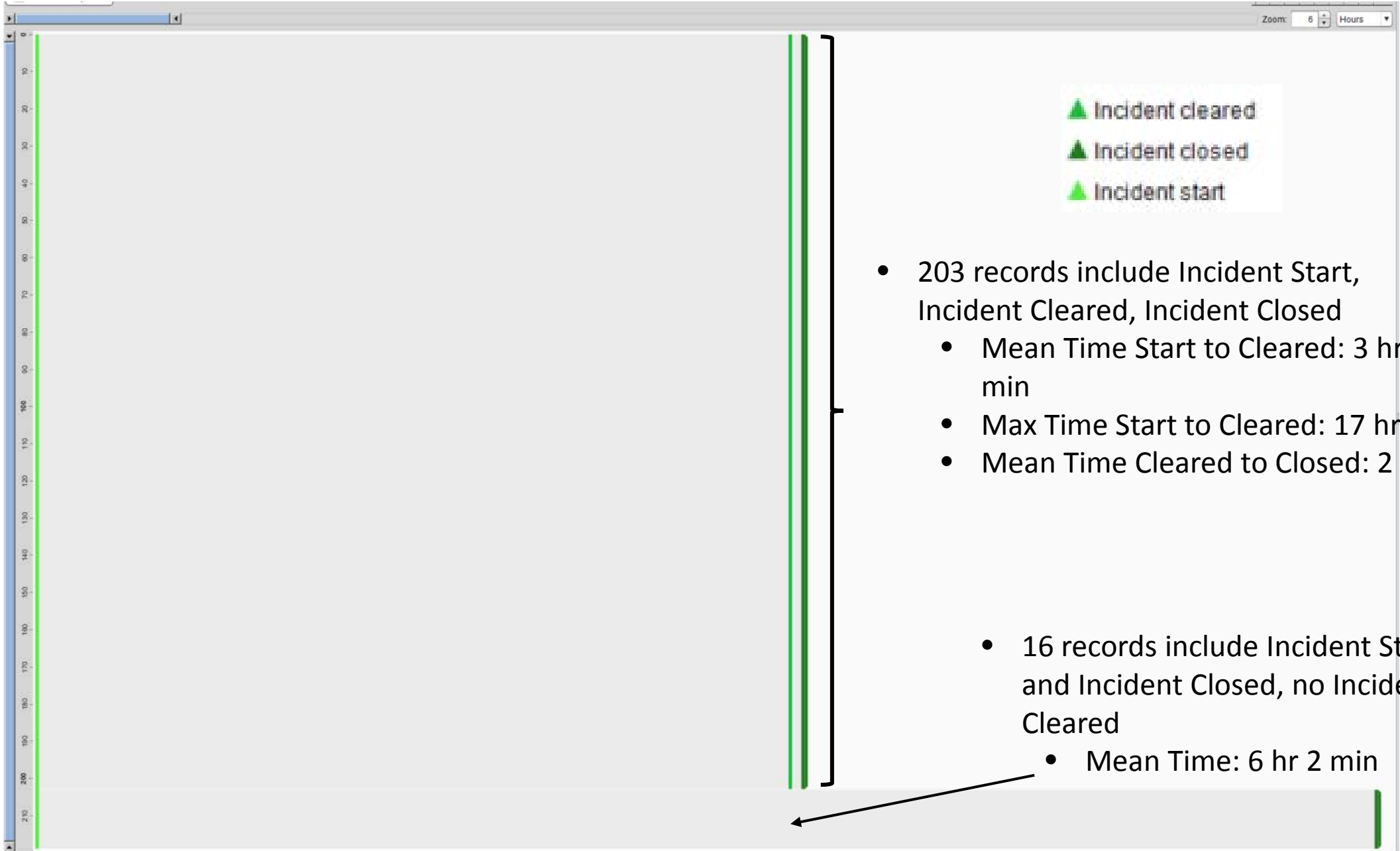




# Incident Clearance Time: 2014 - 2016

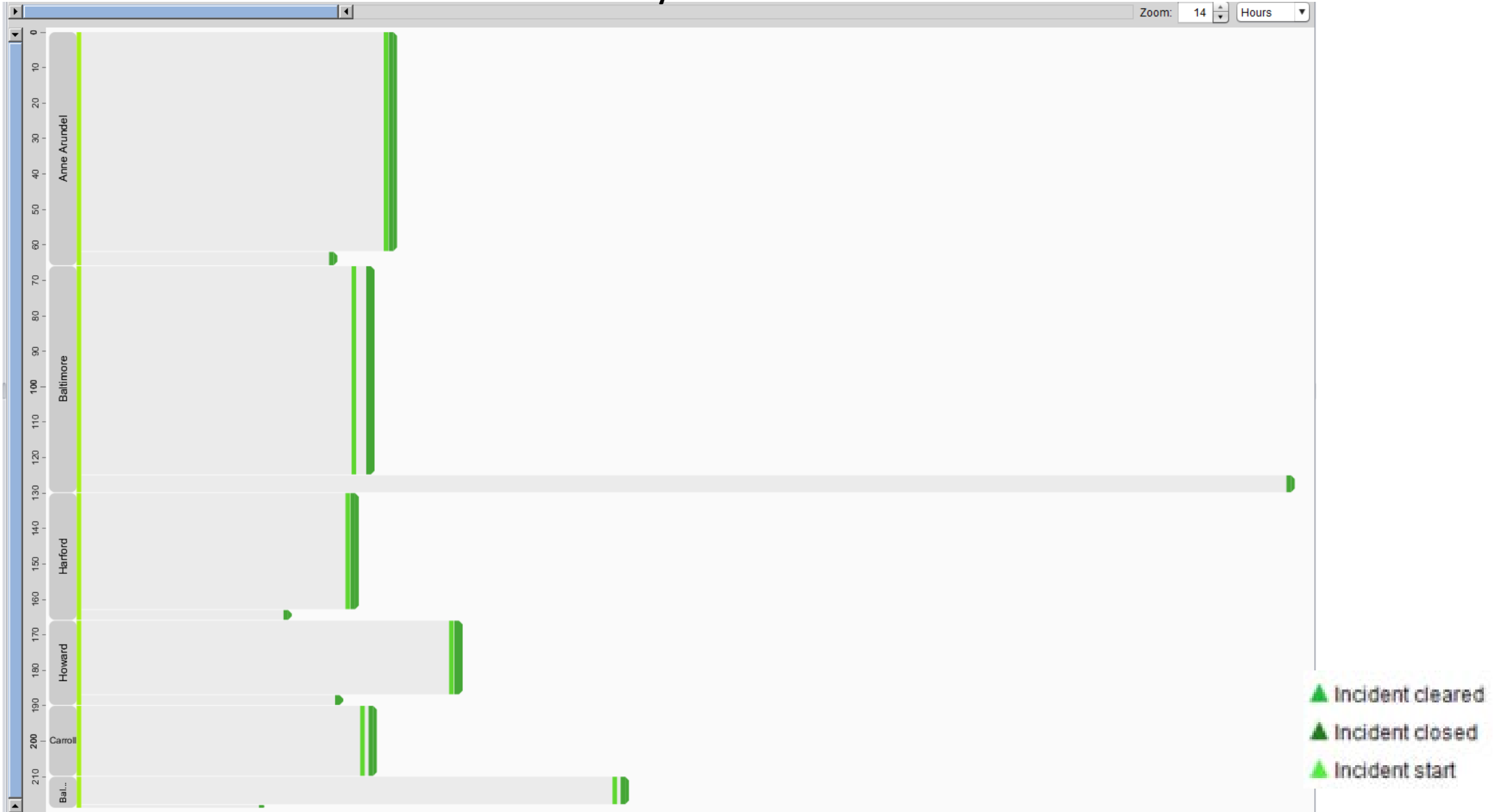
Time →

Number of records



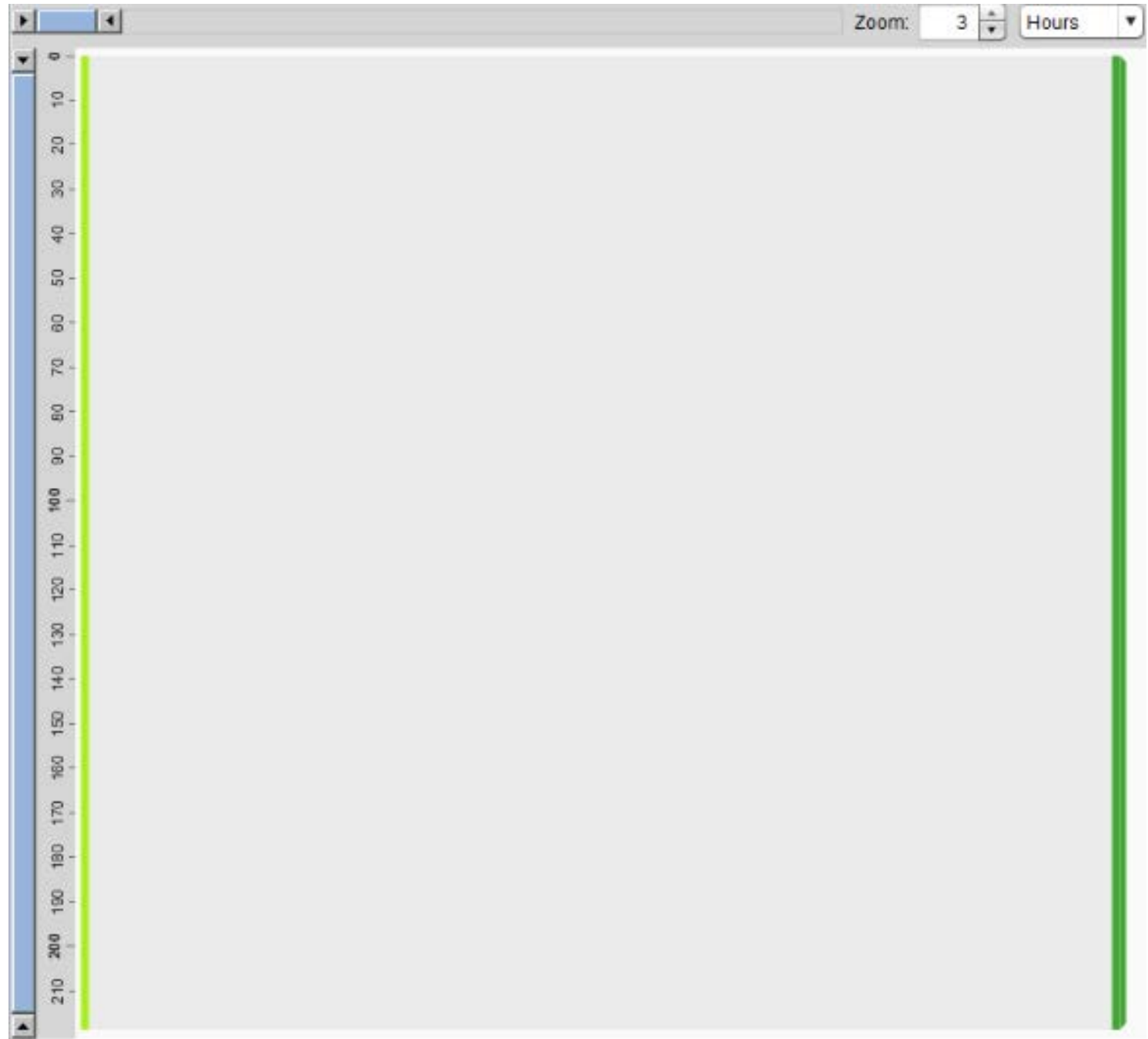
- 203 records include Incident Start, Incident Cleared, Incident Closed
  - Mean Time Start to Cleared: 3 hr 23 min
  - Max Time Start to Cleared: 17 hr
  - Mean Time Cleared to Closed: 2 min
- 16 records include Incident Start and Incident Closed, no Incident Cleared
  - Mean Time: 6 hr 2 min

# Incident Clearance Time: 2014 – 2016 By Jurisdiction



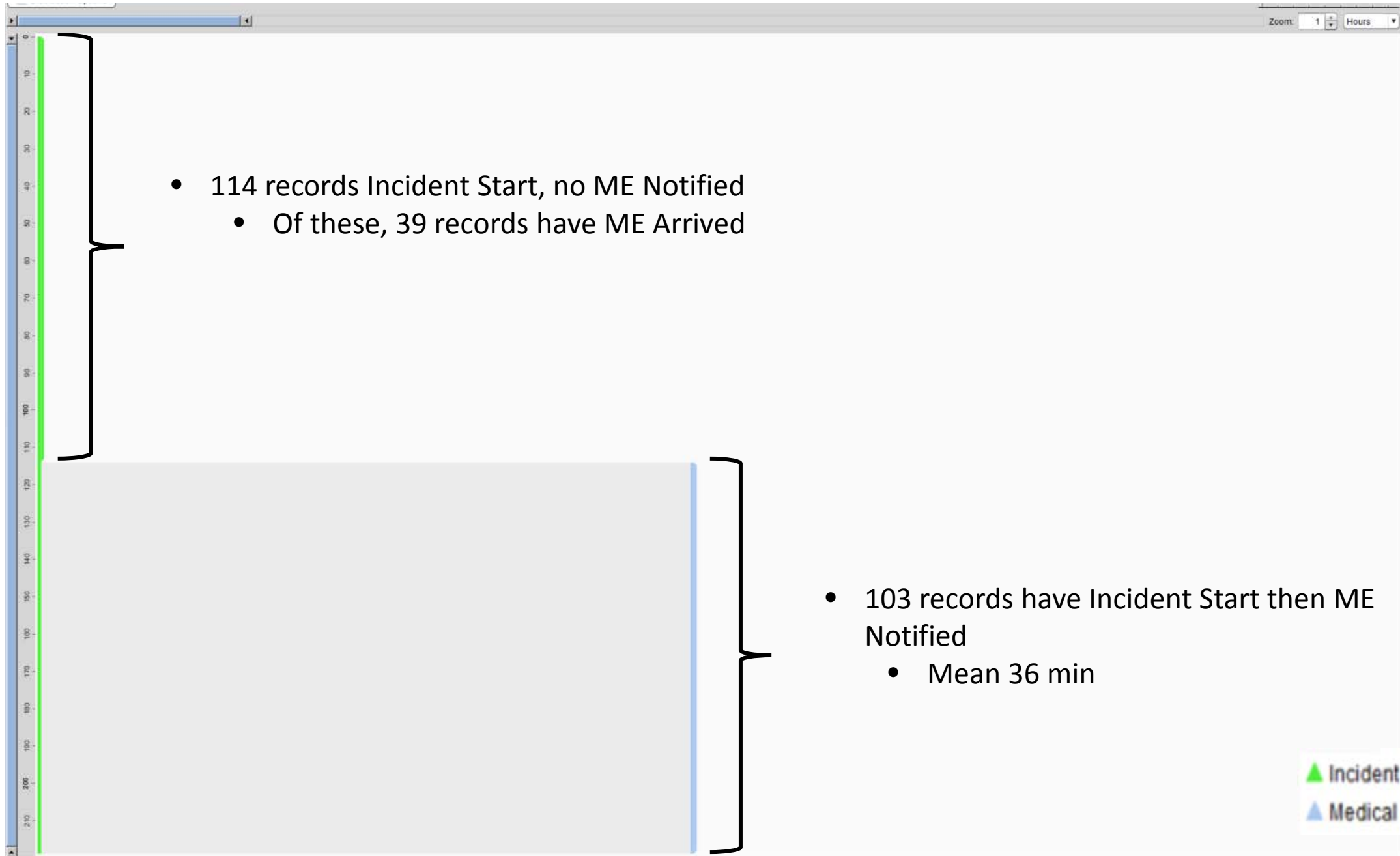
# Incident Start to Incident Closed

Year	No. Records	Mean Time Incident Start to Incident Closed
2014	60	3 hr 12 min
2015	79	2 hr 59 min
2016	80	4 hr 33 min
2014-2016	219	3 hr 37 min

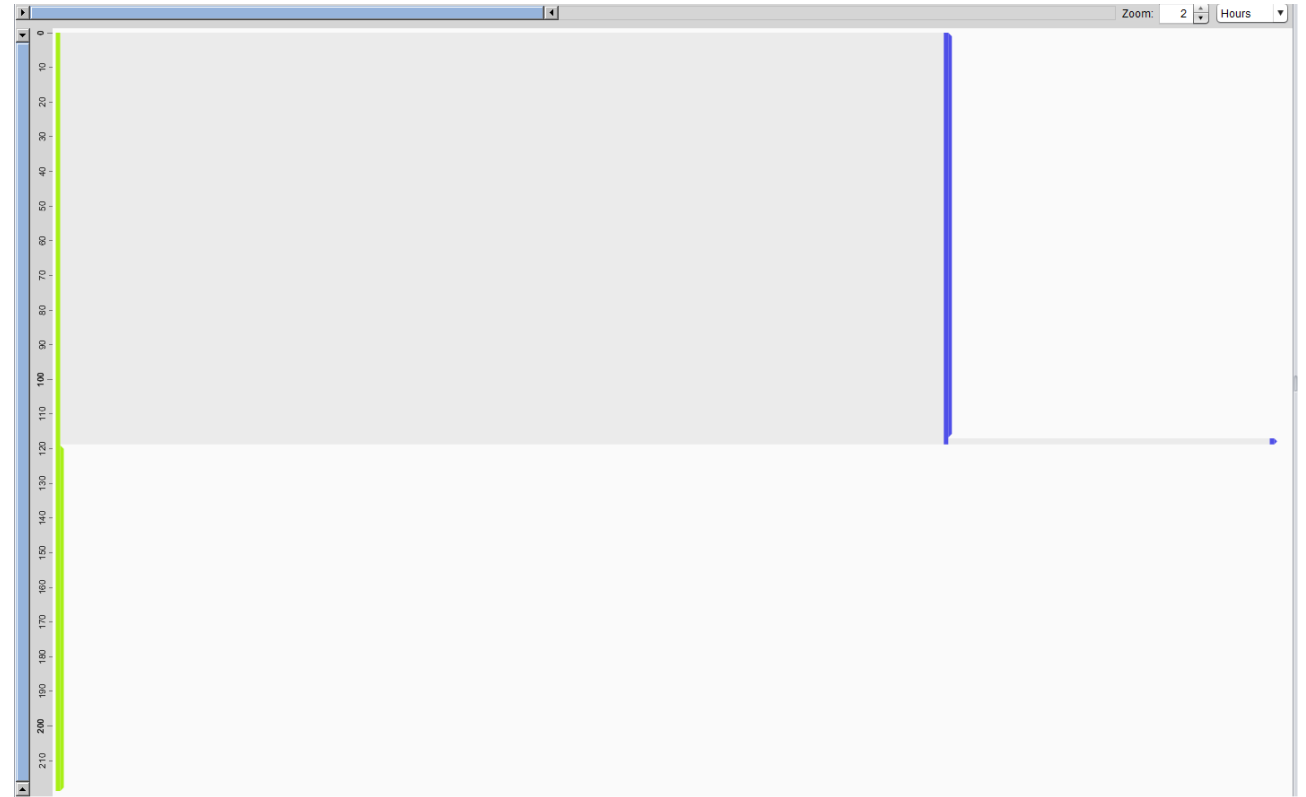
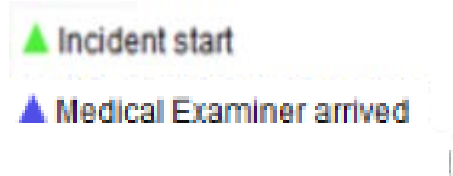


# Medical Examiner Timeline

## Medical Examiner Notified: 2014 - 2016



## Medical Examiner Arrived: 2014 - 2016



Year	No. Records Incident Start and No ME Arrived	No. Records ME Arrived	Time from Incident Start to ME Arrived
2014	31	29	1 hr 50 min
2015	32	47	1 hr 47 min
2016	37	43	1 hr 51 min
2014-2016	100	119	1 hr 49 min

# Incident Start and Medical Examiner Timeline: 2014 - 2016



# Observations

- Consistent, Accurate, and Timely data entry are critical
  - Need consistent categories to facilitate analysis
  - Need correct category selected
  - Need accurate time stamps for notification, arrival, and departure
  - Missing data results in incomplete evaluation
- Better coordination and information flow between agencies is needed
- Operations beginning to rely more on data visualization and mining to make decisions
  - Make sure operations staff know what tools are available
  - Operations staff need to make sure data is being tracked accurately and in a timely fashion
  - Consider automated population of CHART data to EventFlow to enable real-time big picture visualization
- EventFlow can be a useful tool to analyze fatal crash data as well as data from other crash types



# Contacts

## Crash Data

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EXTRAS

# Constructing the EventFlow Overview

