

# FINDING PATTERNS IN TEMPORAL DATA

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UNIVERSITY OF MARYLAND

27th HCIL Symposium  
May 27, 2010



# FINDING PATTERNS IN TEMPORAL DATA

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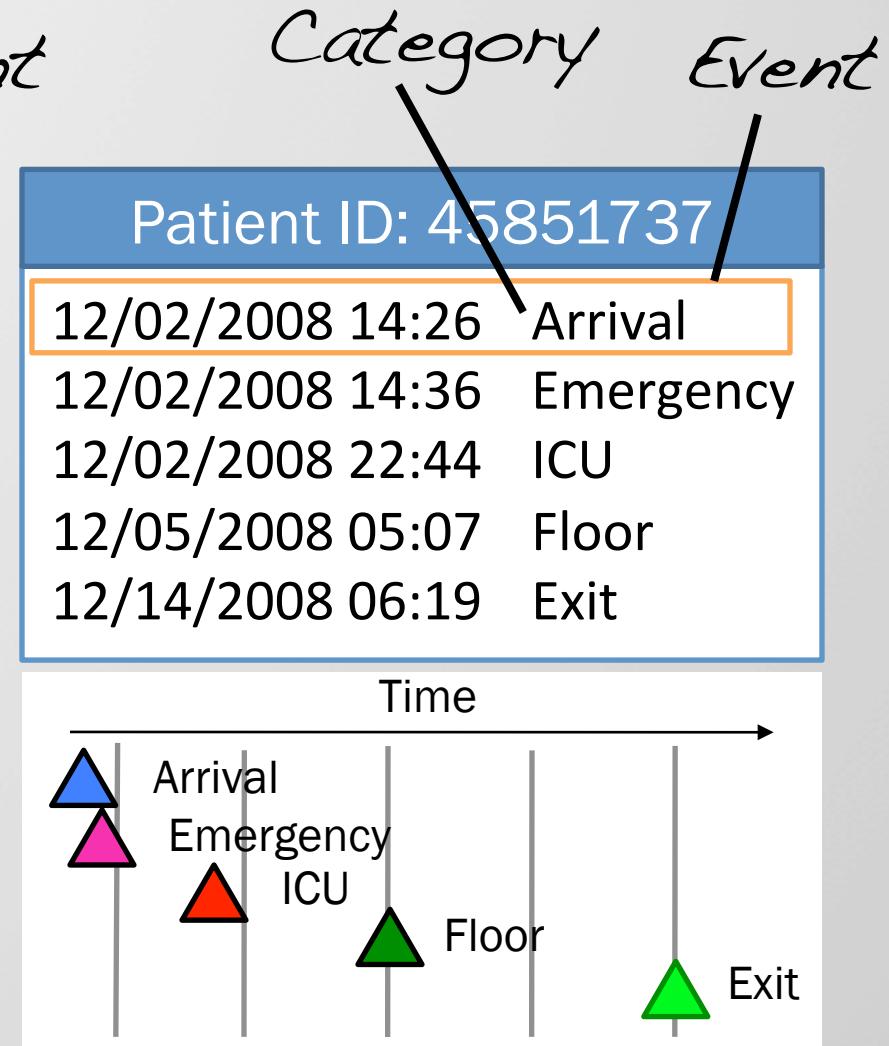
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# TEMPORAL CATEGORICAL DATA

- A type of time series



# TEMPORAL CATEGORICAL DATA



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

**Traffic incident logs:** arrival/departure time of each unit

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

**Others:** web logs, usability study logs, etc.



10+ years work on temporal visualization  
(mostly on Electronic Health Records)

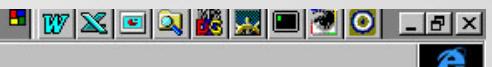
# LIFELINES

SINGLE RECORD



[Plaisant et al. 1998]

<http://www.cs.umd.edu/hcil/lifelines>



File Edit View Go Favorites Help

Back

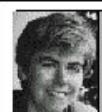
Links Best of the Web

Channel Guide

Customize Links

Internet Explorer News

Internet Start



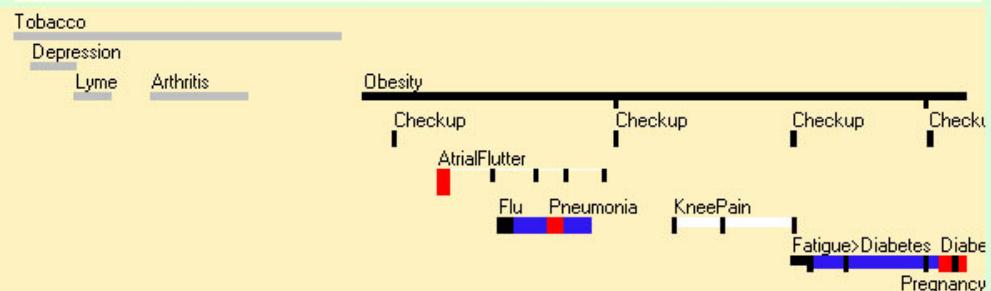
**Linda Simpson**  
Female 40

Line from input file: %,3-10-1997,3-12-1997,black,p10,Sonogram,images/babysonogra

LifeLine

92 93 94 95 96 97

▼ Notes



▼ Hosps.

Appendectomy

▼ Tests

BloodEKG EKG Xray Blood

▼ Meds.

Prozac Heartdrug Ventolin Antib. Advil Advil Insulin Insulin

▼ Others

PhysicalTherapy

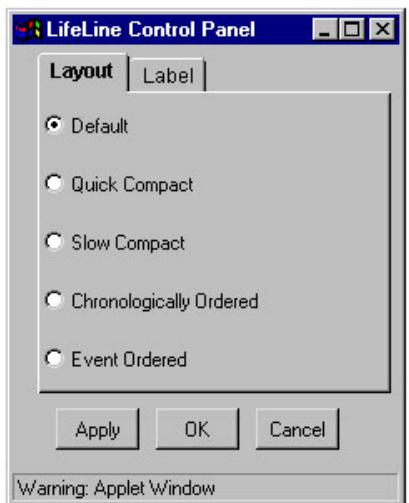
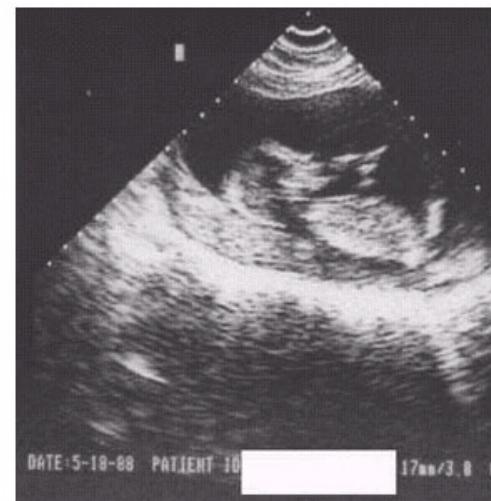
▼ Immun.

LowSaltFatDiet TBtest Tetanos Flu

92 93 94 95 96 97

load

Control Panel



# LifeLines – Single Patient



## WORKING WITH PHYSICIANS AT WASHINGTON HOSPITAL CENTER

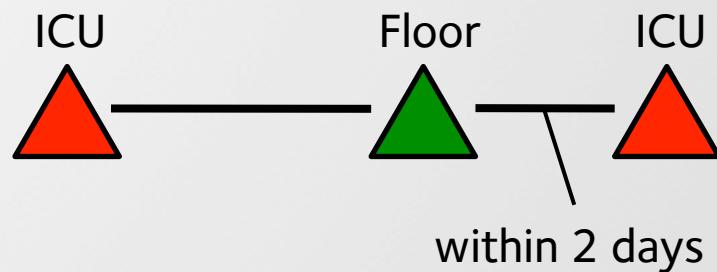
# EXAMPLE DATA

- Patient transfers

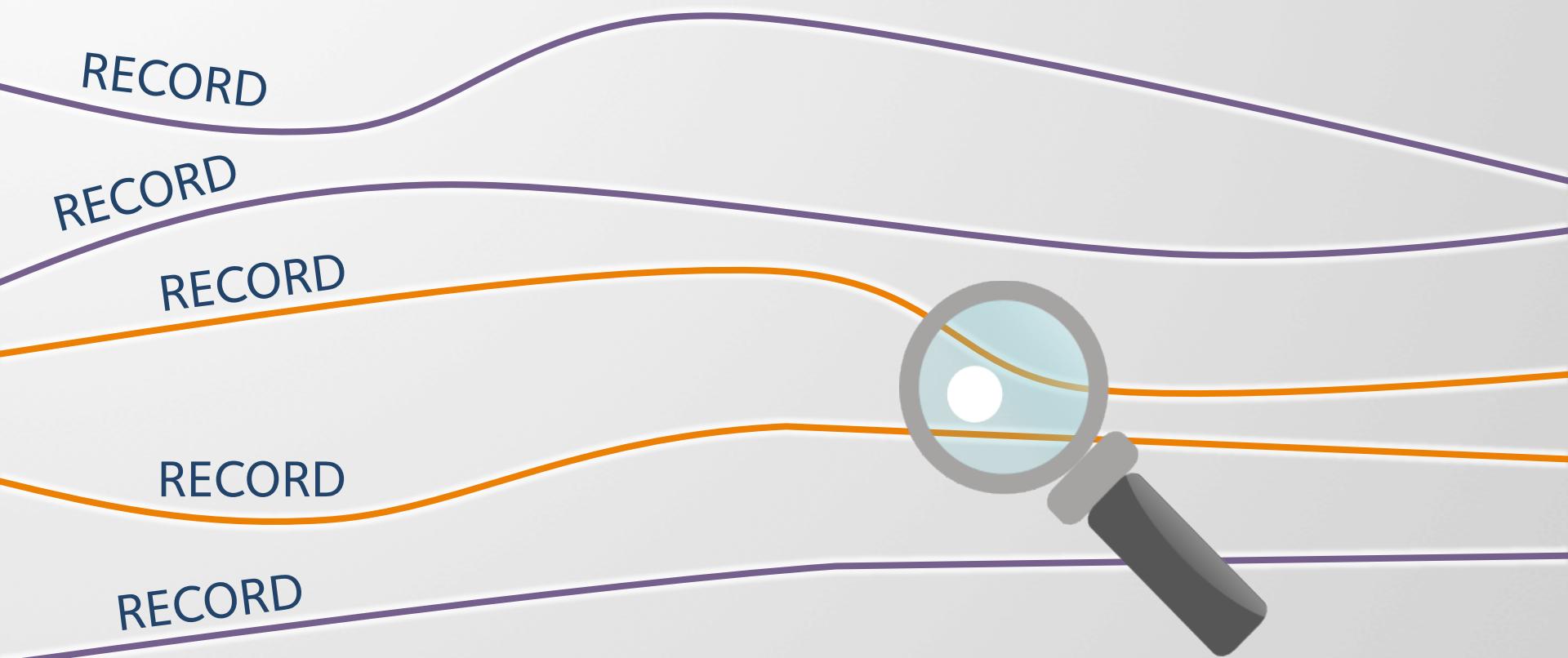
|  |                           |
|--|---------------------------|
|  ARRIVAL      | Arrive the hospital       |
|  EMERGENCY    | Emergency room            |
|  ICU          | Intensive Care Unit       |
|  INTERMEDIATE | Intermediate Medical Care |
|  FLOOR        | Normal room               |
|  EXIT-ALIVE  | Leave the hospital alive  |
|  EXIT-DEAD  | Leave the hospital dead   |

# TASKS

- Example: Finding “Bounce backs”



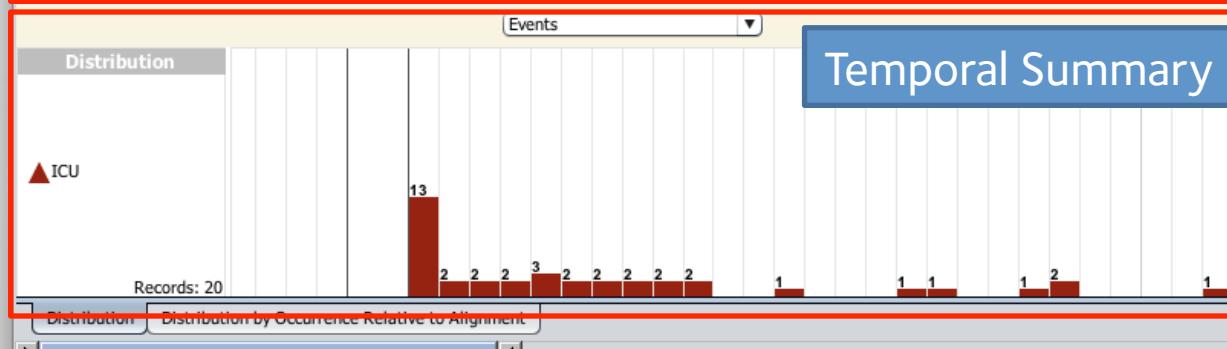
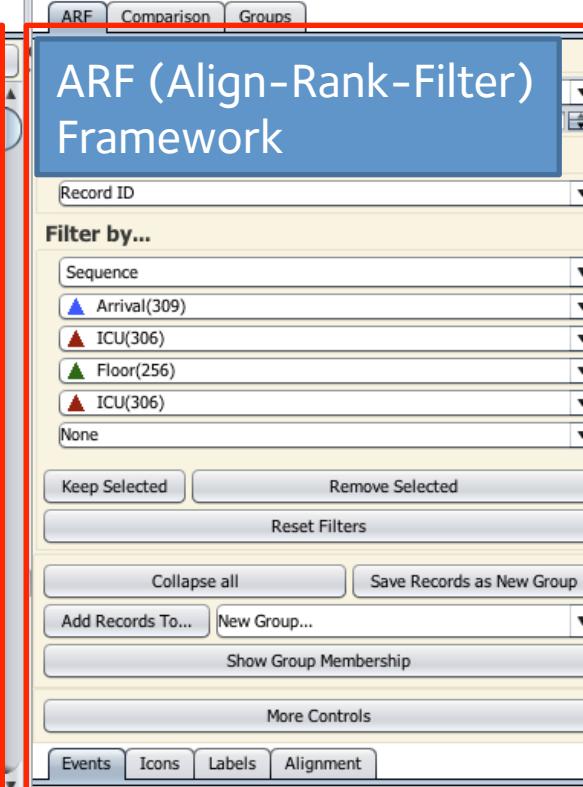
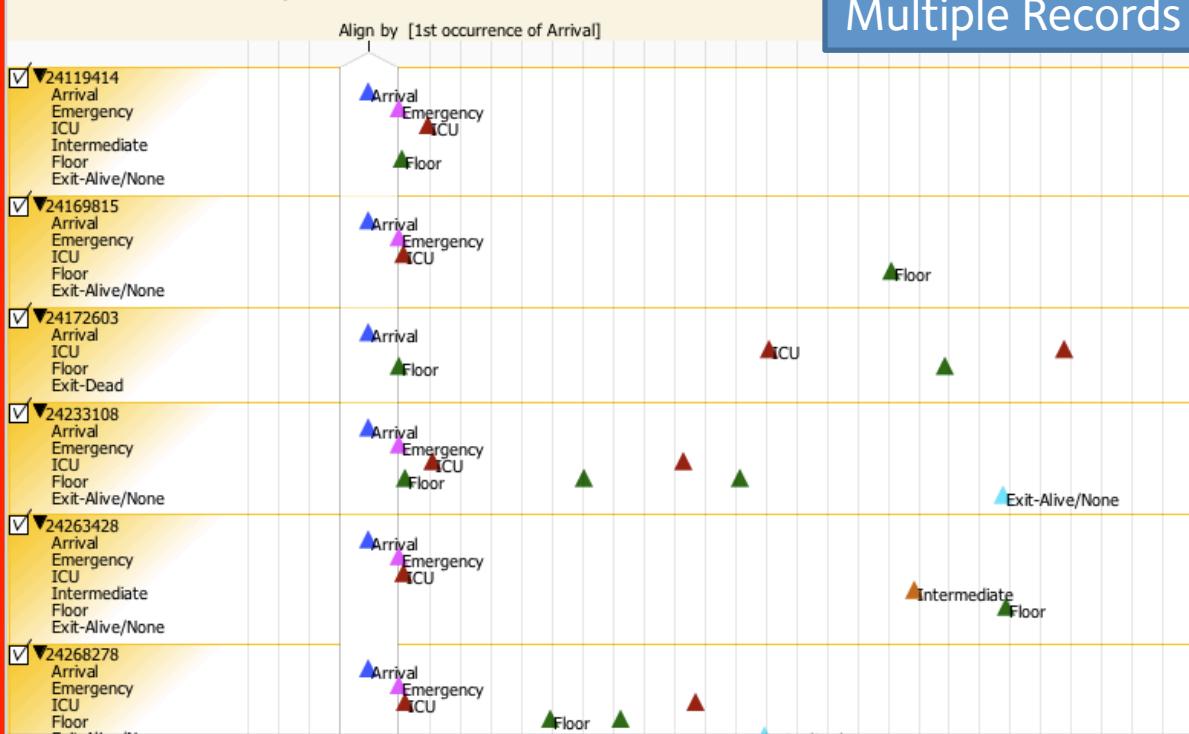
# LIFELINES 2



[Wang et al. 2008, 2009]  
<http://www.cs.umd.edu/hcil/lifelines2>



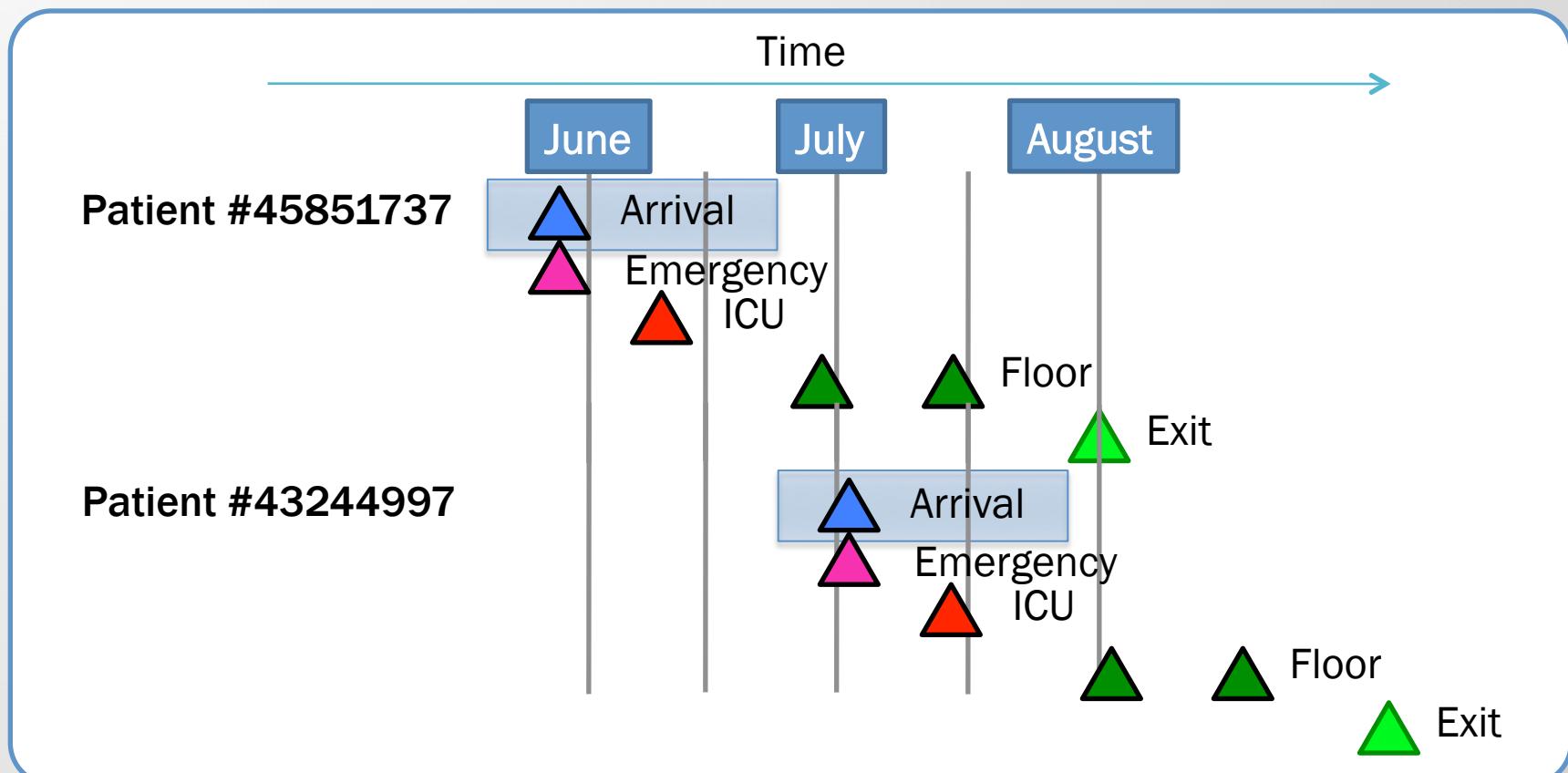
All Records Records 20/309 20



# LifeLines2 – Search and Visualize

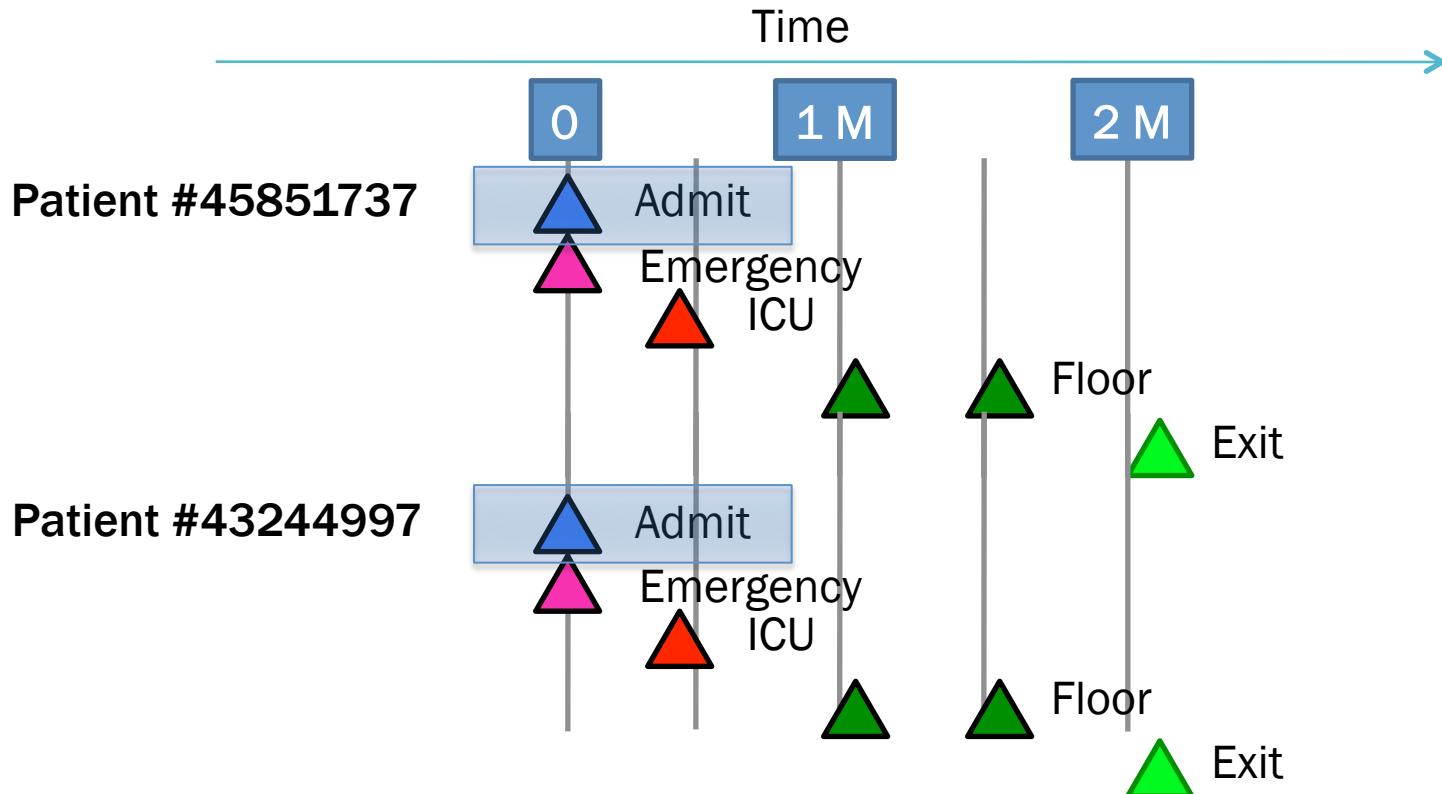
# ALIGNMENT

- Sentinel events as reference points

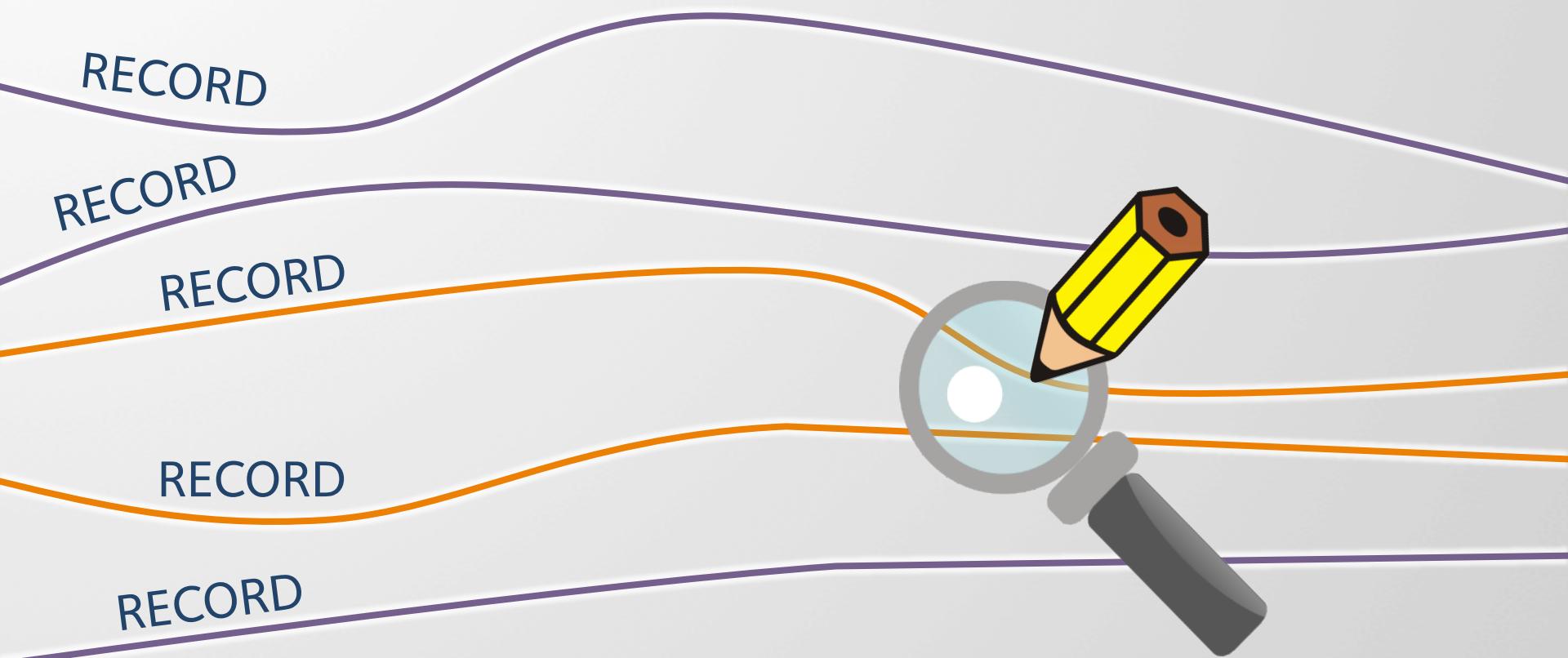


# ALIGNMENT (2)

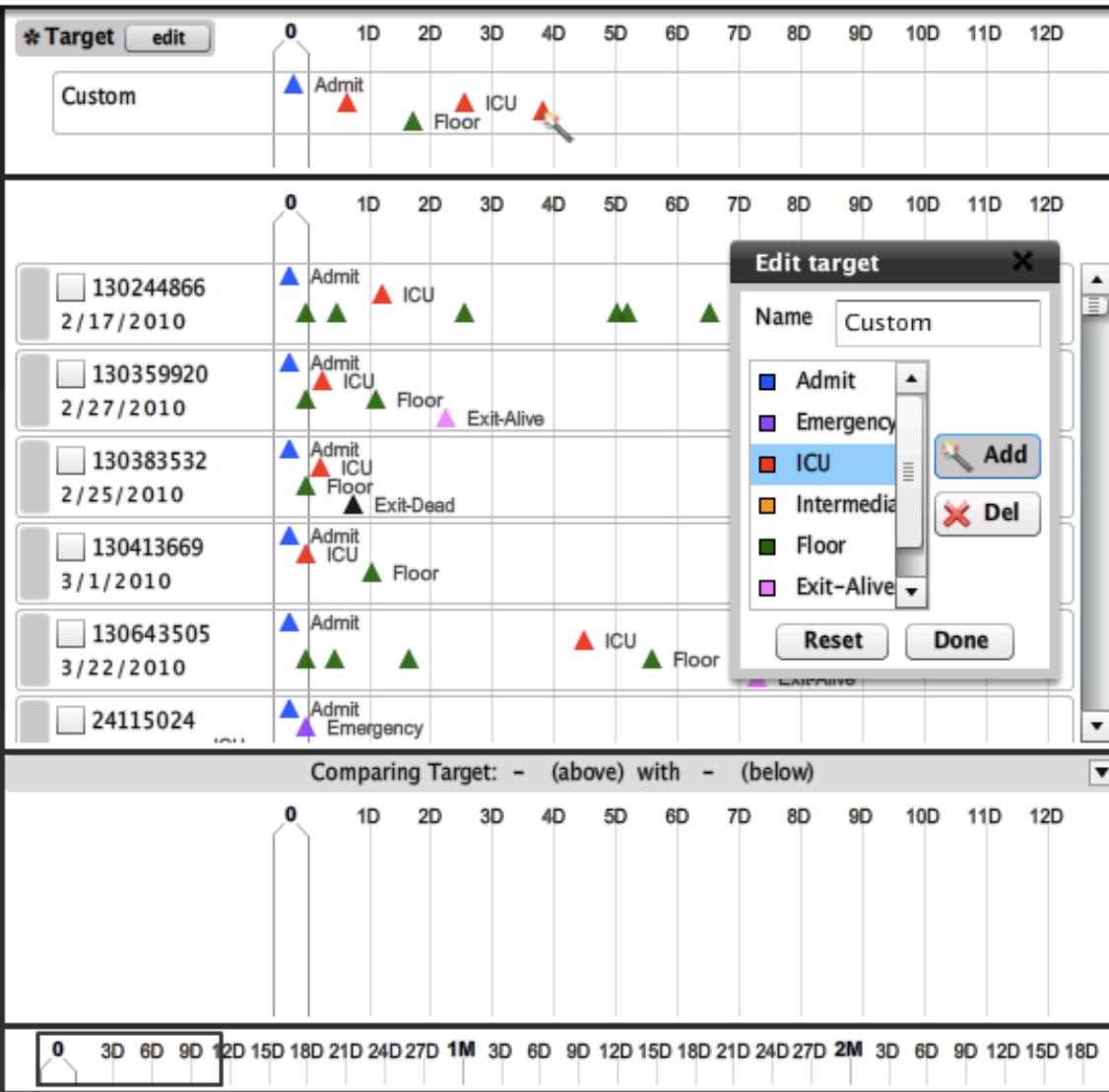
- Time shifting



# SIMILAN



[Wongsuphasawat & Shneiderman 2009]  
<http://www.cs.umd.edu/hcil/similan>



Search Filters Weight

Align by Admit

Similarity Search

- Select Target (Drag and Drop)  
Custom
- Select Categories
  - Include in Search
  - Visible

|                                     |                                     |                   |
|-------------------------------------|-------------------------------------|-------------------|
| <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | Admit (309)       |
| <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | Emergency (259)   |
| <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | ICU (338)         |
| <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | Intermediate (50) |
| <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | Floor (406)       |
| <input checked="" type="checkbox"/> | <input checked="" type="checkbox"/> | Exit-Alive (202)  |
- Choose time difference precision  
hour
- Specify Range of Interest (optional)  
[None]

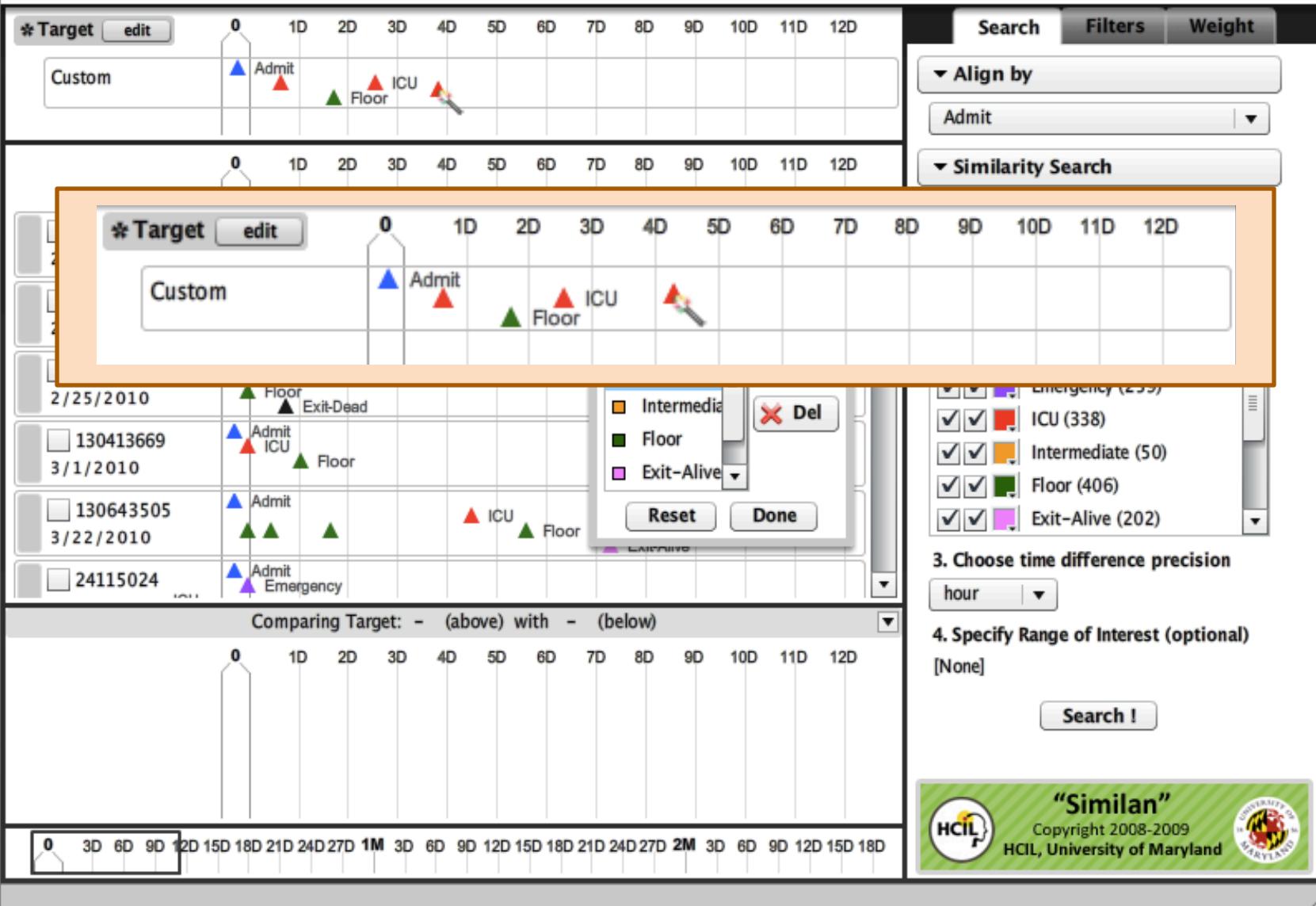
Search !

**Similan**  
Copyright 2008-2009  
HCIL, University of Maryland

# Similan – Search by Similarity

File Edit Settings Help

Showing 309 / 309 records



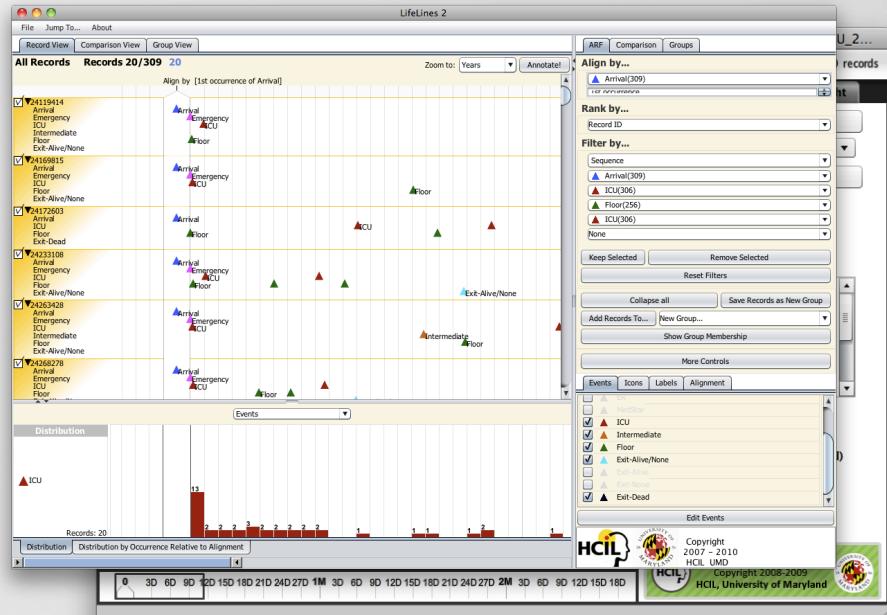
# Similan – Search by Similarity

# FINDING “BOUNCE BACKS”

Before



After



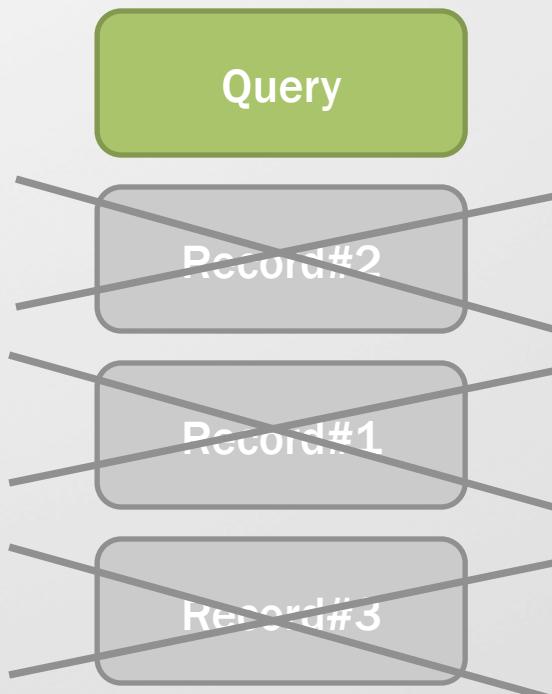
- Much faster to specify new query
- Visualizing the results gives better understanding

# USER STUDIES: SEARCH

## LIFELINES2

*Exact*

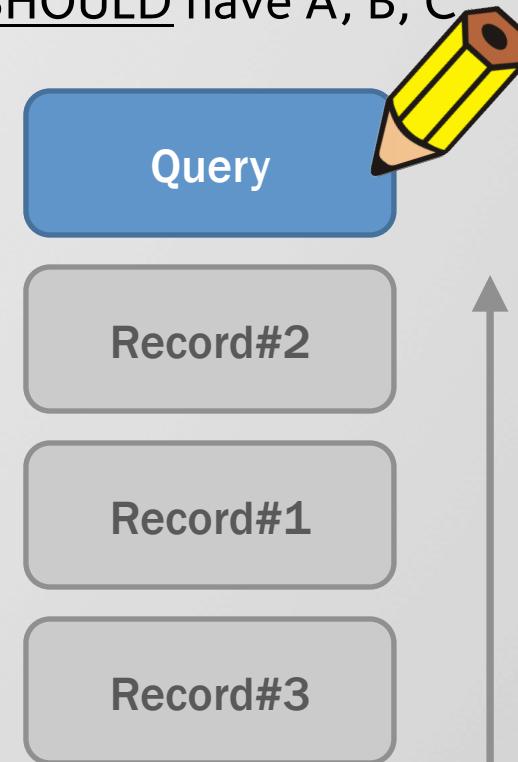
MUST have A, B, C



## SIMILAR

*Similarity-based*

SHOULD have A, B, C

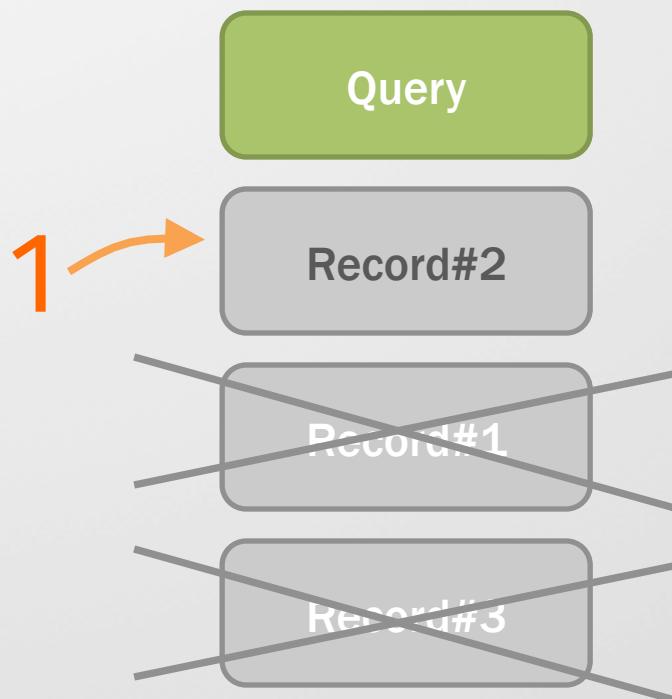


# USER STUDIES: SEARCH

## LIFELINES2

*Exact*

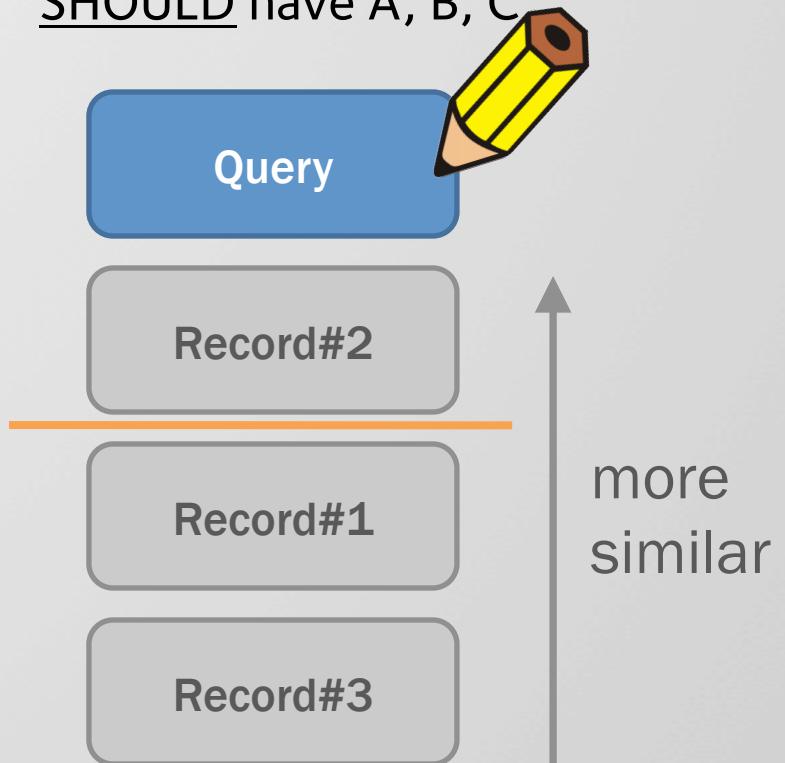
MUST have A, B, C



## SIMILAR

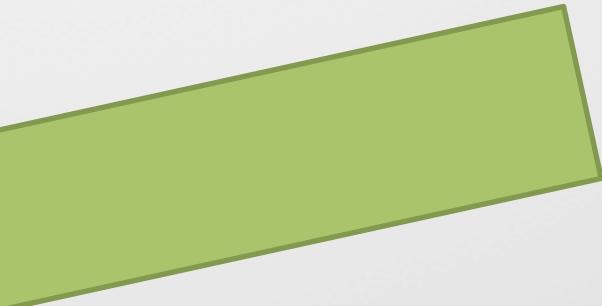
*Similarity-based*

SHOULD have A, B, C



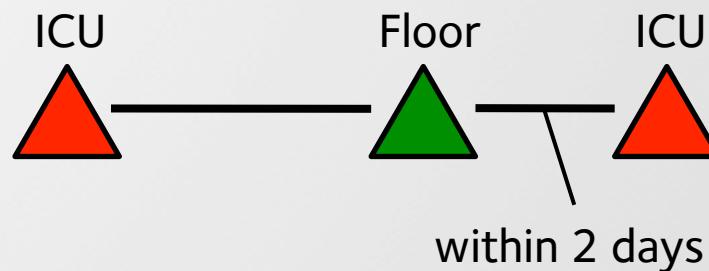
# **NEW STUFF**

*Needs for an overview -> LifeFlow!*

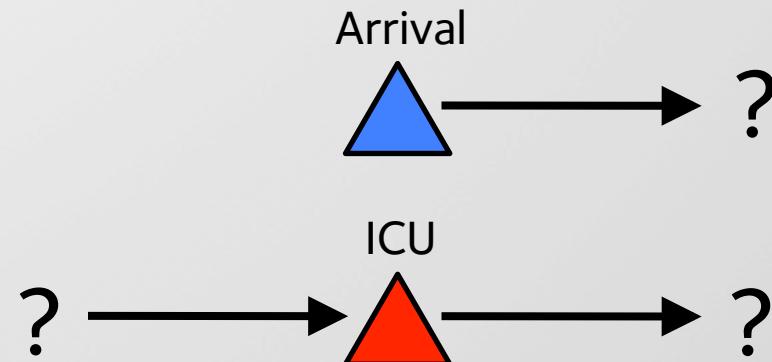


# TASKS

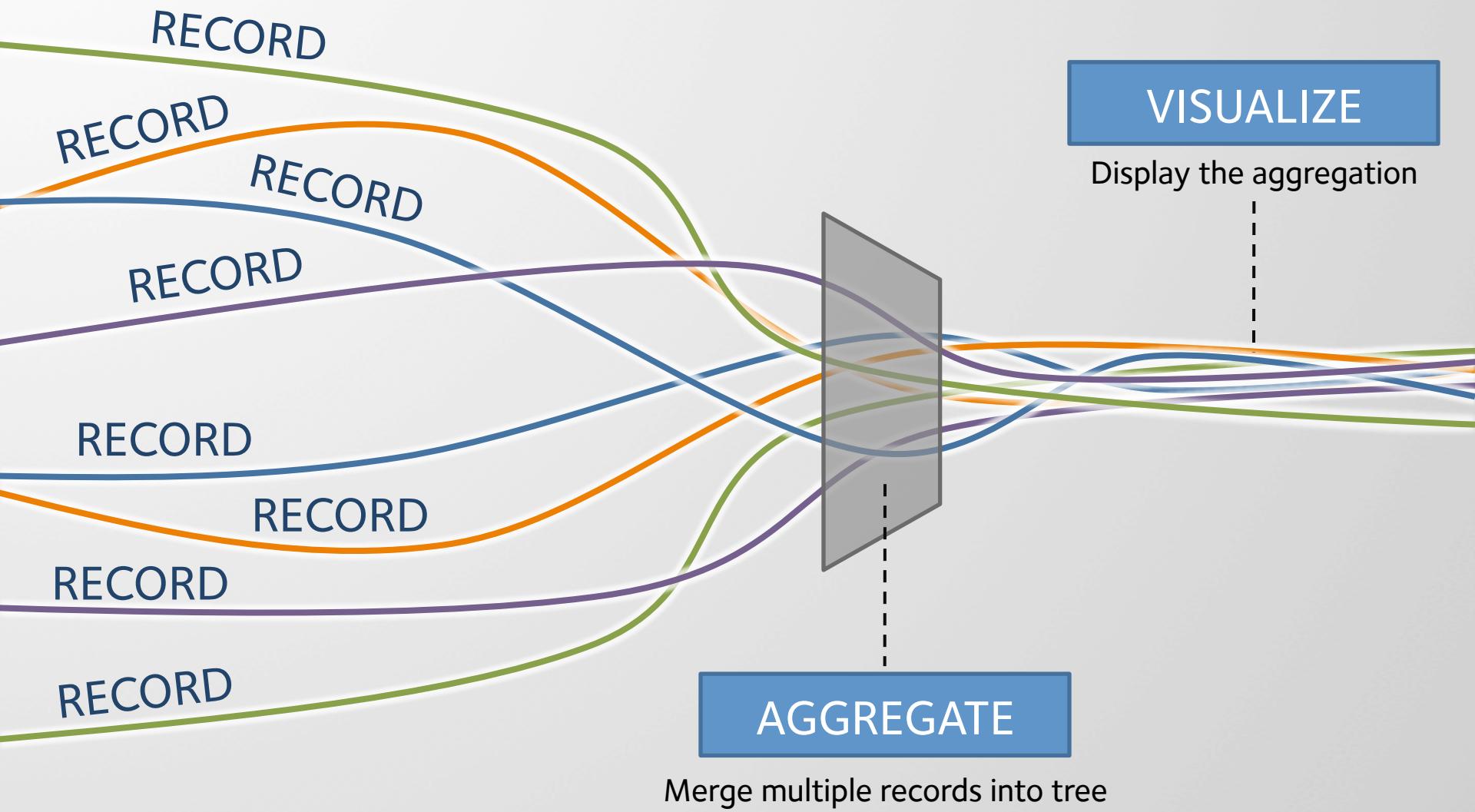
- Example: Finding “Bounce backs”



- Other questions

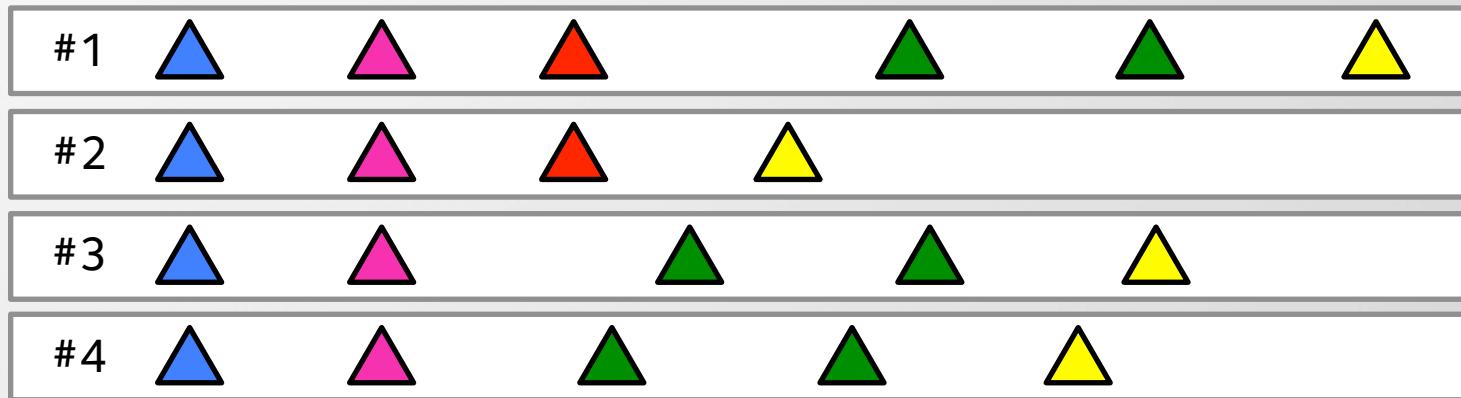


# LIFEFLOW



# AGGREGATE

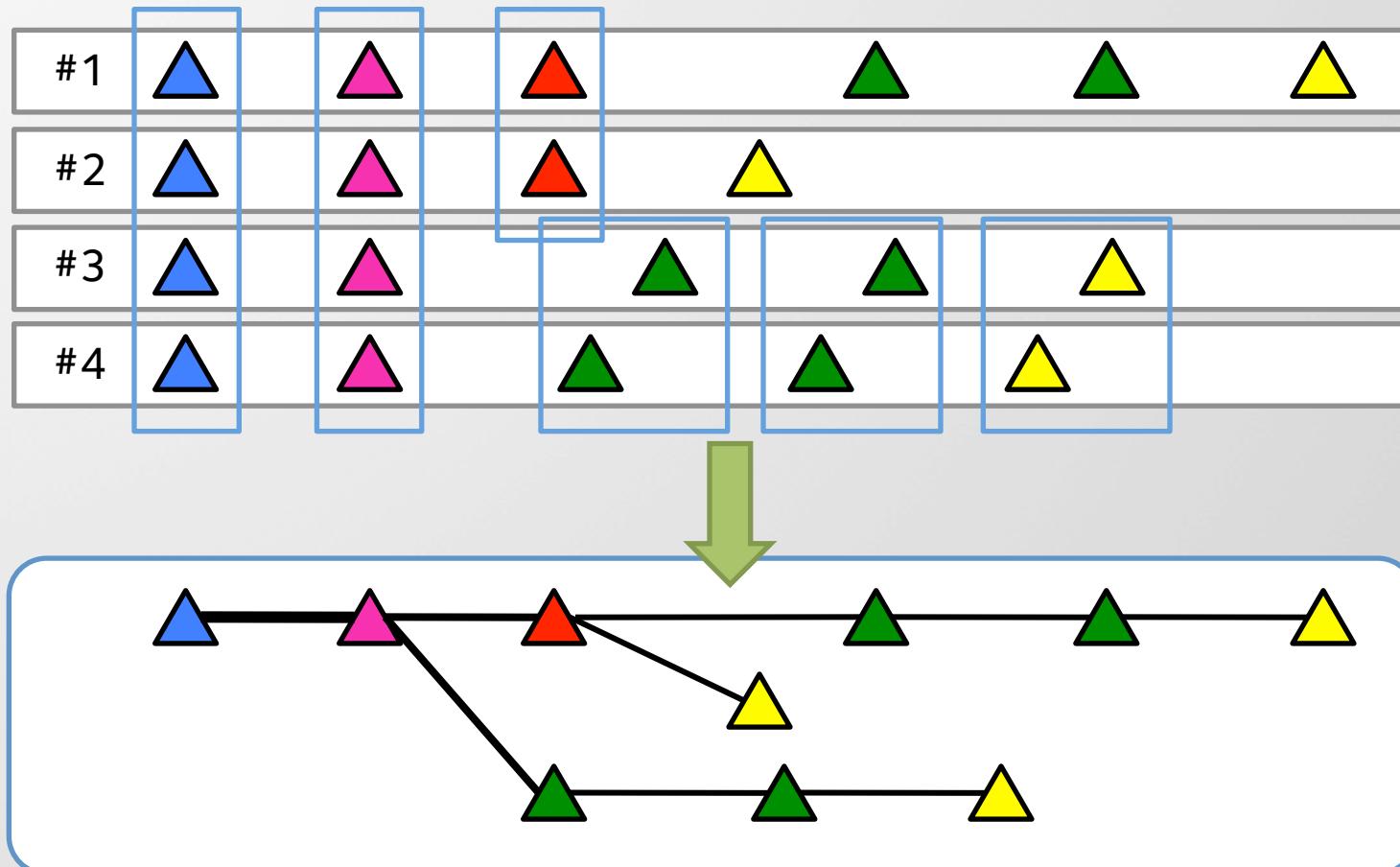
- Aggregate by prefix



Example with 4 records

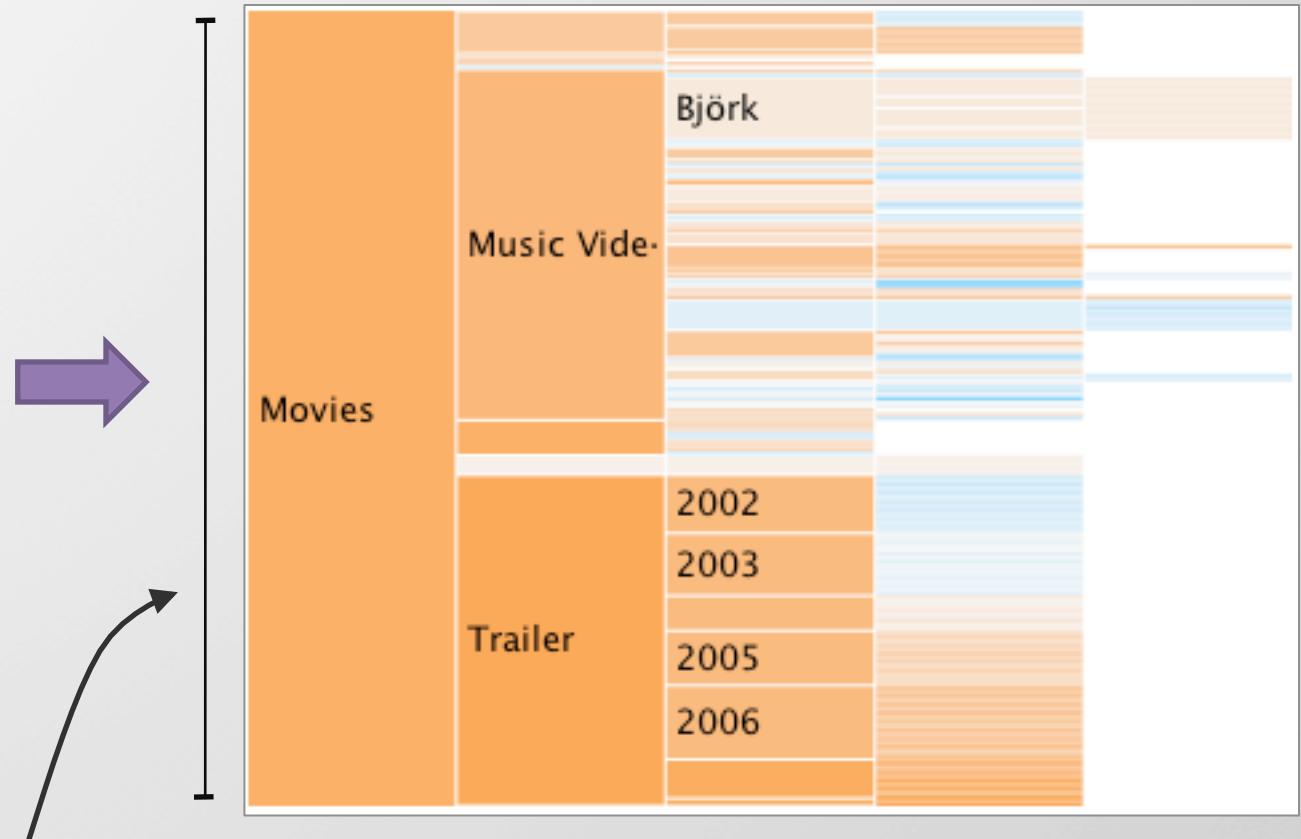
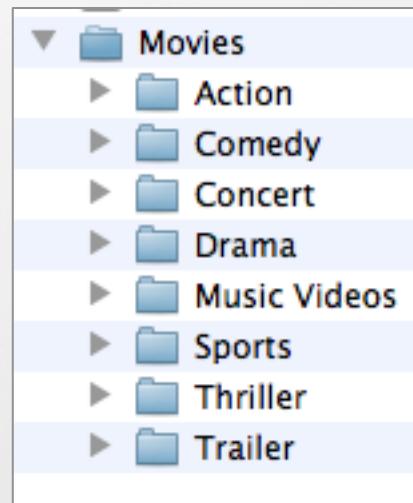
# AGGREGATE

- Aggregate by prefix



# VISUALIZE

- Inspired by the Icicle tree [Fekete 2004]



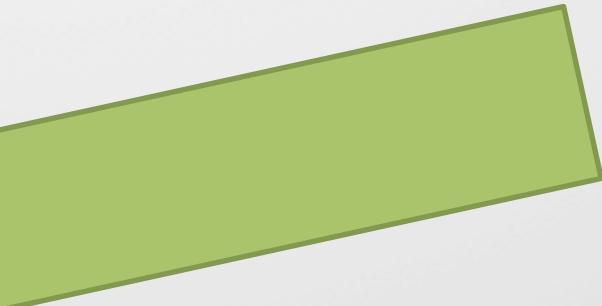
*Number of files*

# VISUALIZE (2)

- Use horizontal axis to represent time
- Video

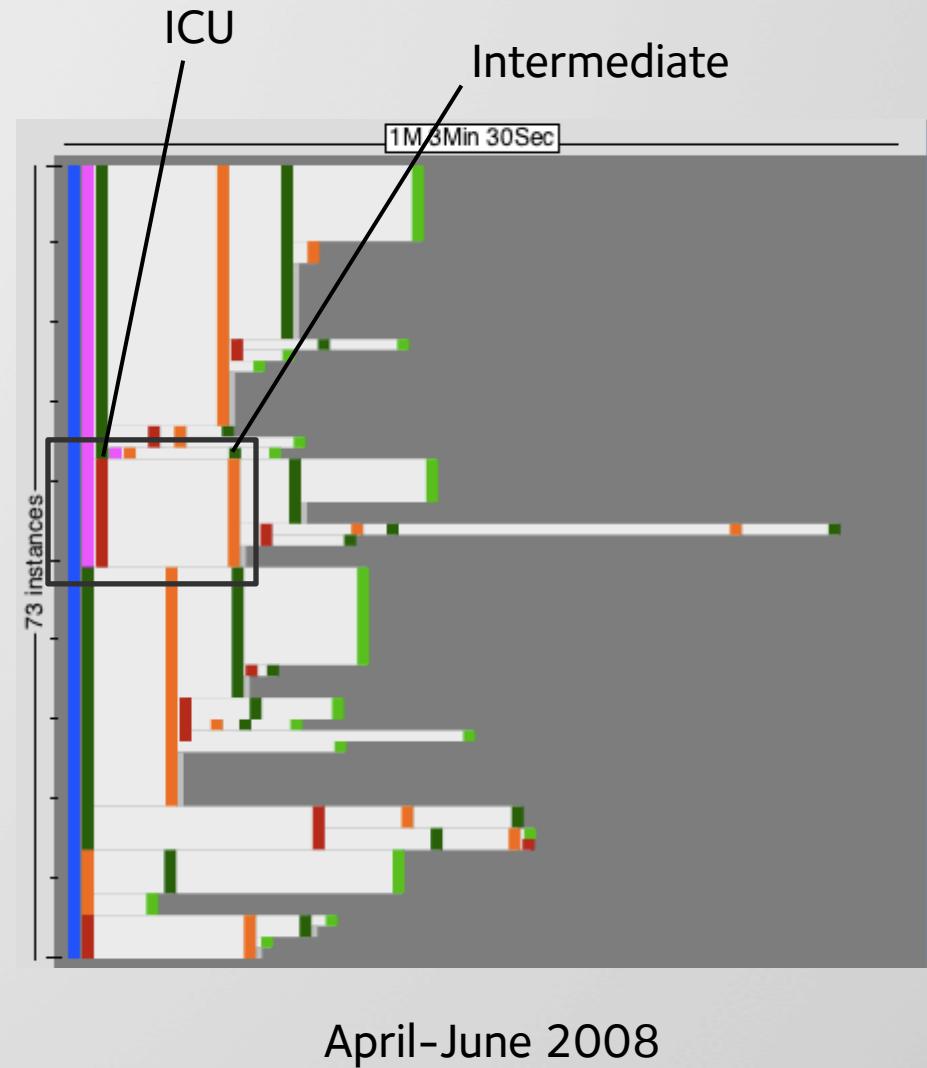
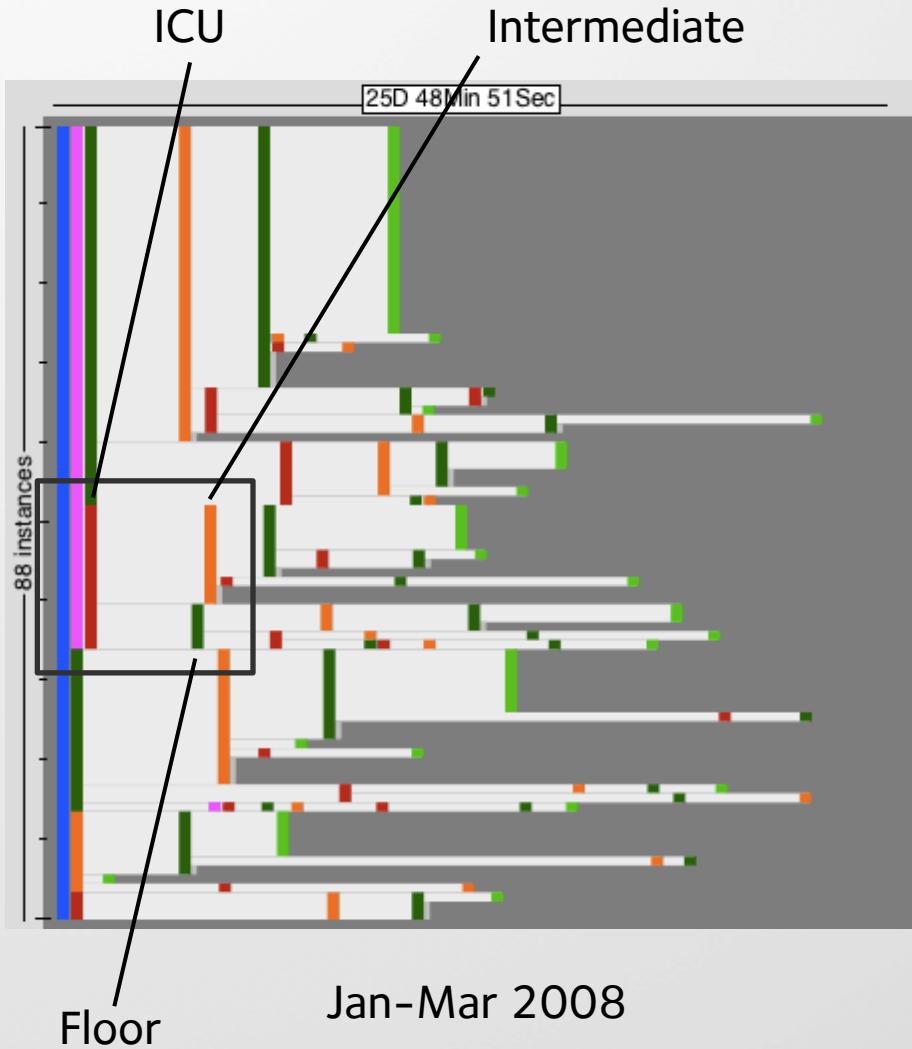
# **DEMO – LIFEFLOW**

*When the lines are combined into flow*



# FUTURE WORK

- Comparison



# TAKE-AWAY MESSAGE

INFORMATION VISUALIZATION IS A POWERFUL WAY  
TO EXPLORE TEMPORAL PATTERNS.

YOU CAN WORK WITH US  
ON NEW CASE STUDIES.

