

# EG2013 Tutorial on VIDEO VISUALIZATION

## 5. Visual Analytics of Video Data

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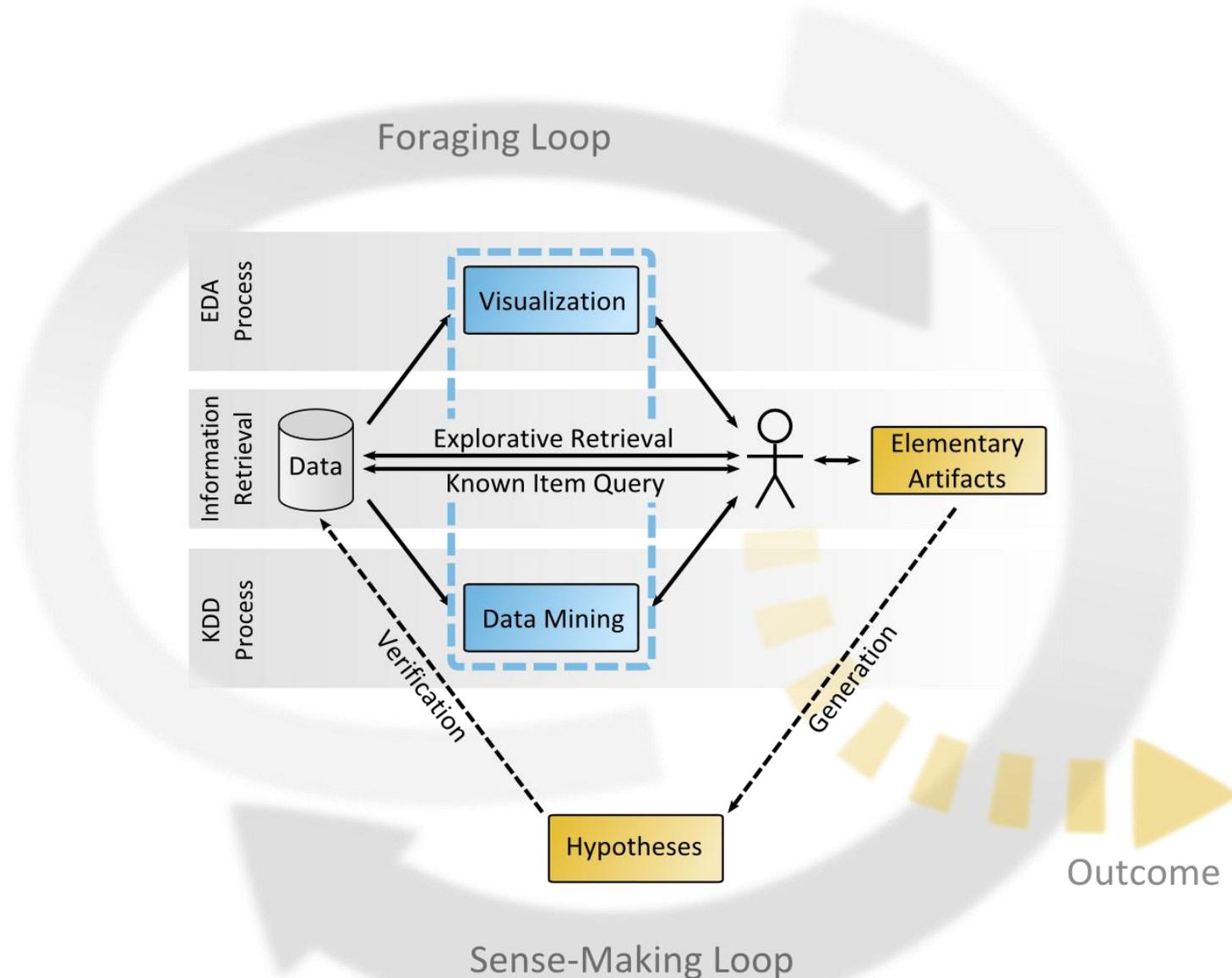


# Video Analysis Challenges

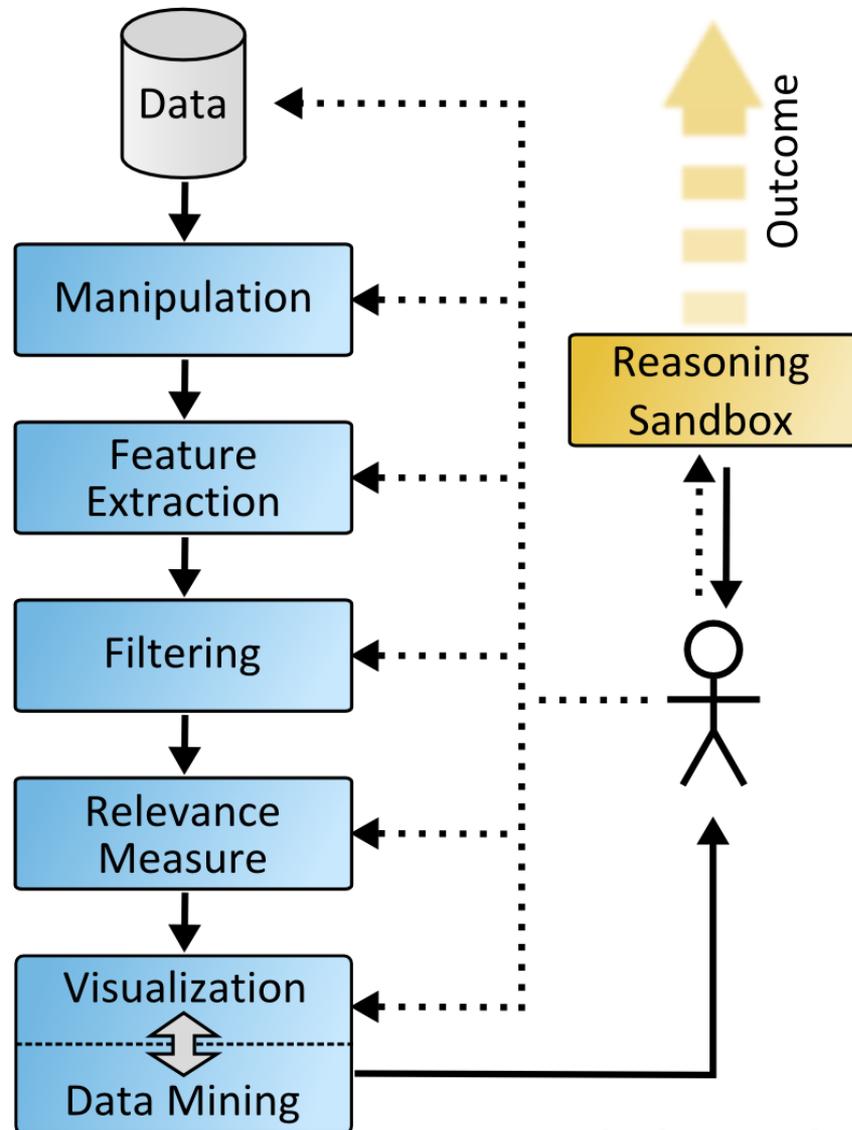


- Vast amount of data
- Complexity of video data
  - Illumination, projection, noise
- Quality of search target definition
  - Ill-defined vs. well-defined search targets
  
- Completely automated or manual analysis fail
- Combination of strengths of both parts
  
- Visual analytics of video data

# Visual Analytics of Video Data



# Video Visual Analytics Pipeline



[Höferlin2013]

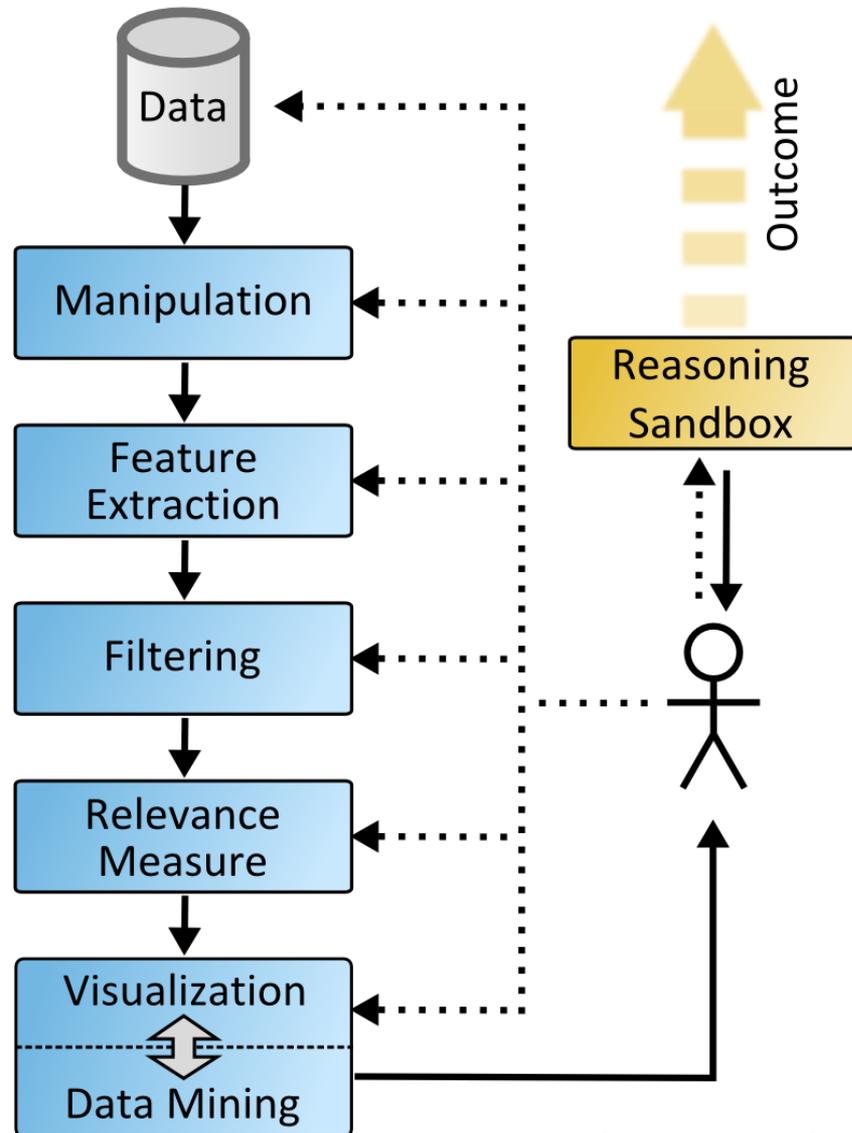
## ■ Important aspects for video analysis

- Data scalability
  - Achieved by serialization, parallelization, data reduction
  - For human and machine
- Task scalability
- Situational awareness

## ■ Video Visual Analytics Pipeline

- Stream processing
- Human analyst interact with all stages
- Support for **foraging** and **sense-making** loop

# Data Streams

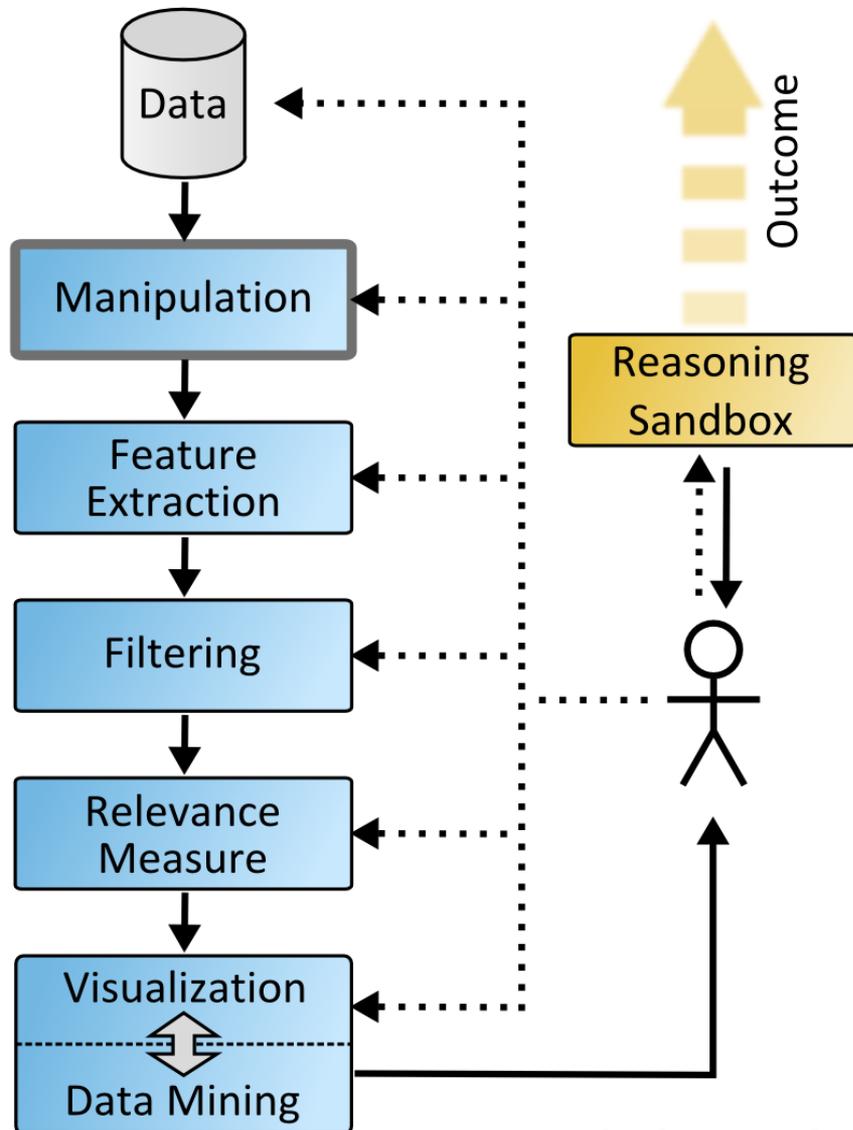


[Höferlin2013]

## ■ Data

- Selection: one or multiple data streams
- Temporal synchronization

# Manipulation

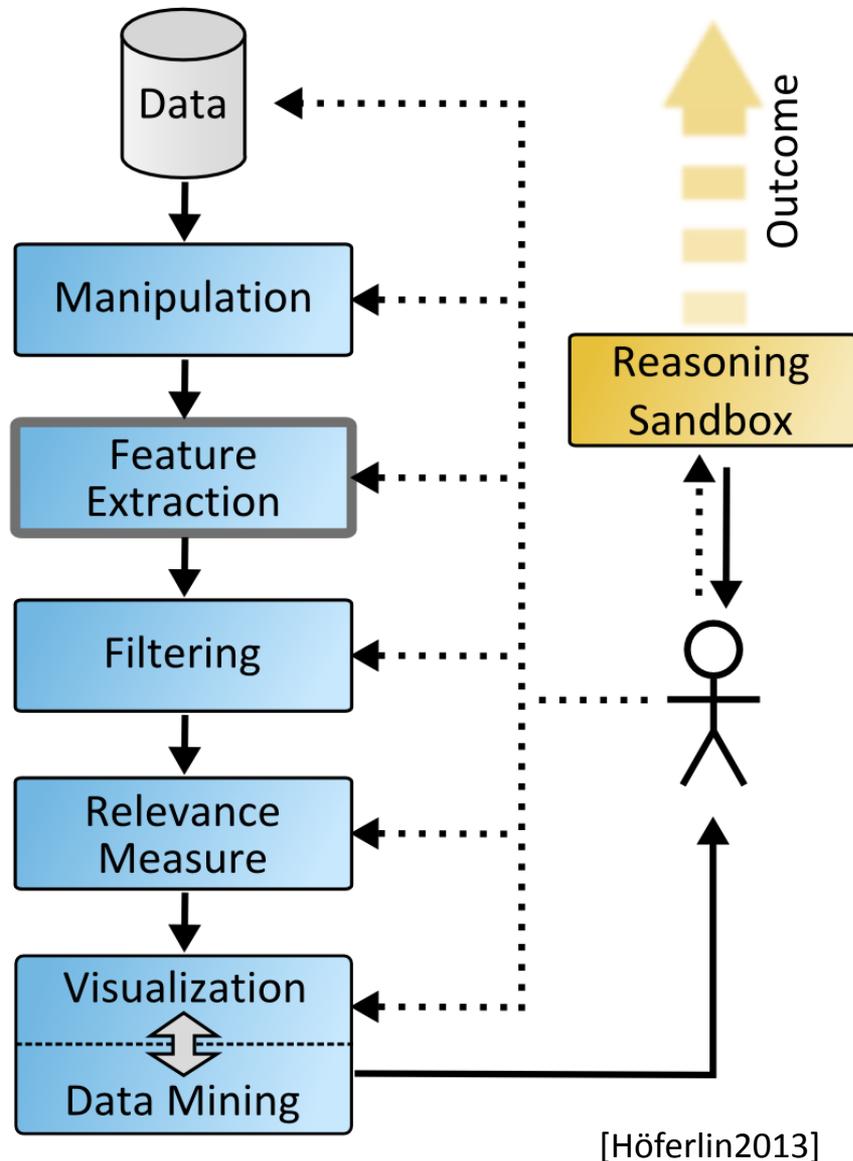


[Höferlin2013]

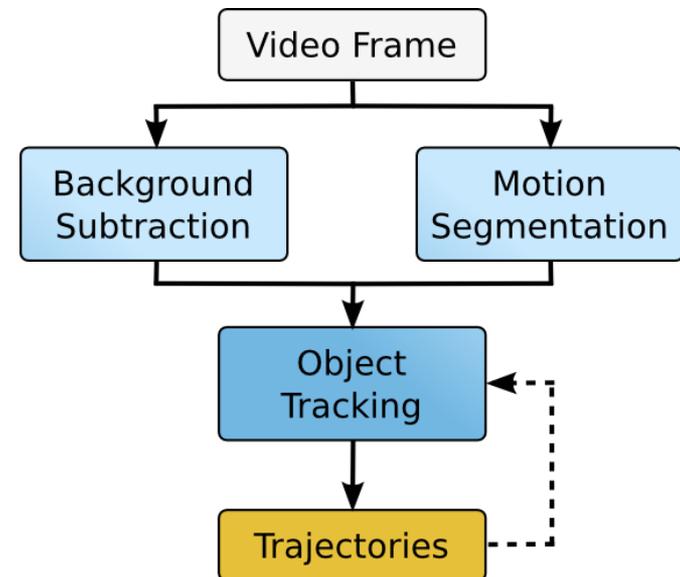
## ■ Manipulation

- Does not change data type
- Enhance raw data

# Feature Extraction

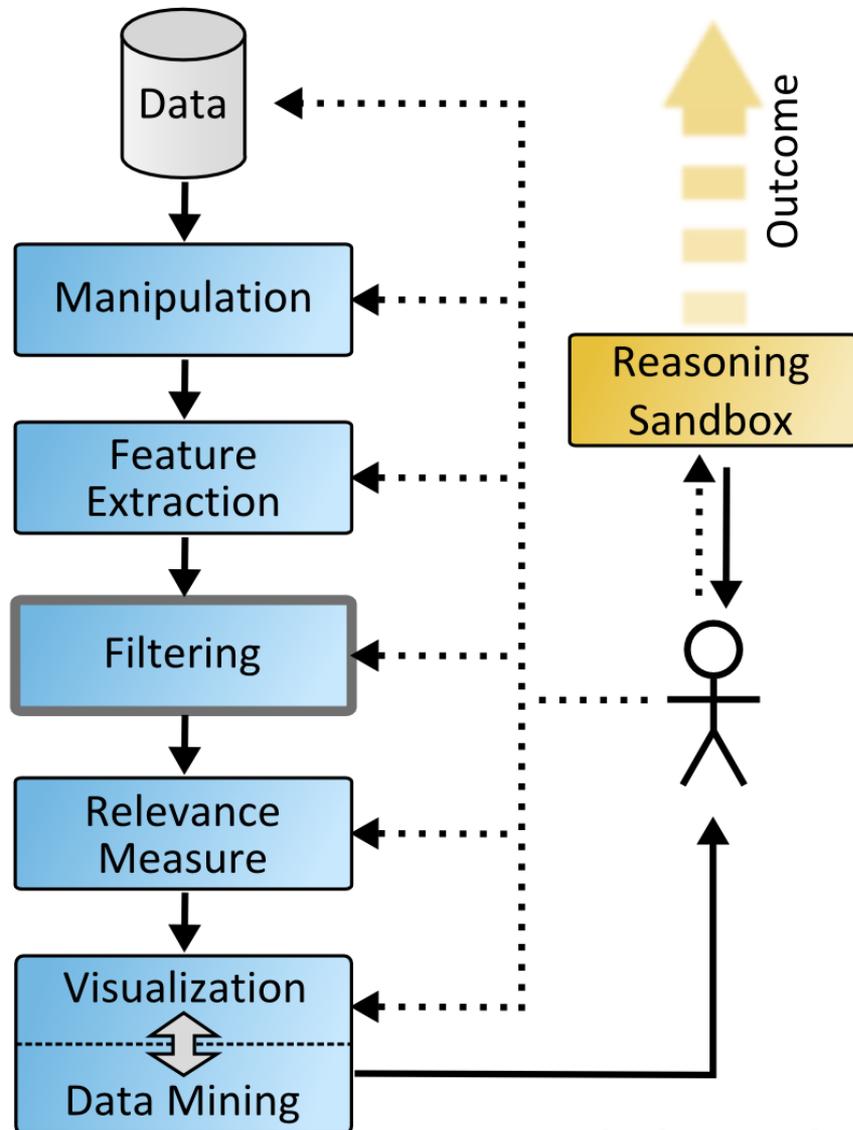


- Feature extraction
  - For usage in later stages
- Important feature: trajectories



[Höferlin2011]

# Filtering



[Höferlin2013]

- Filtering
  - Data reduction
- Interaction guidelines
  - Easy-to-use filter definition
  - Confidence-incorporated filter definition
  - Decision-guided filter definition
  - Filter feedback

# Filtering



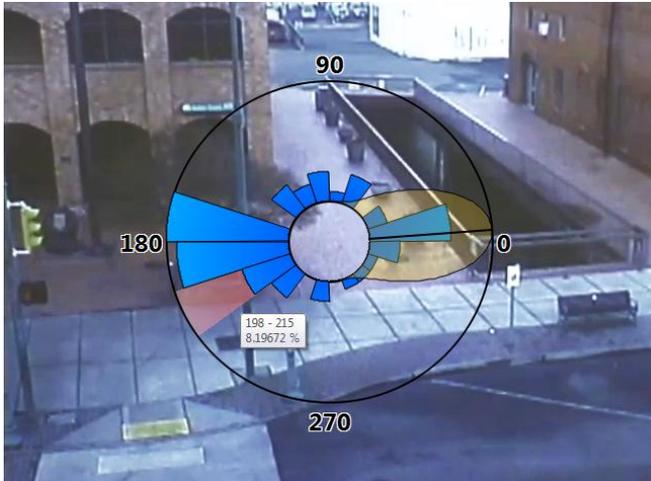
[Höferlin2013]



[Höferlin2013]

- Filtering
  - Data reduction
- Interaction guidelines
  - Easy-to-use filter definition
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  - Filter feedback
- Filter formulation
  - By example
  - By sketch

# Filtering



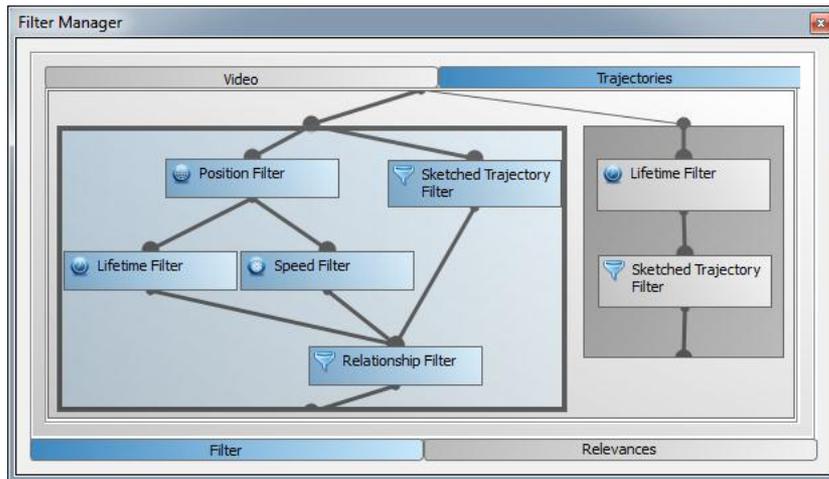
[Höferlin2011]



[Höferlin2011]

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  - By example
  - By sketch
  - By properties

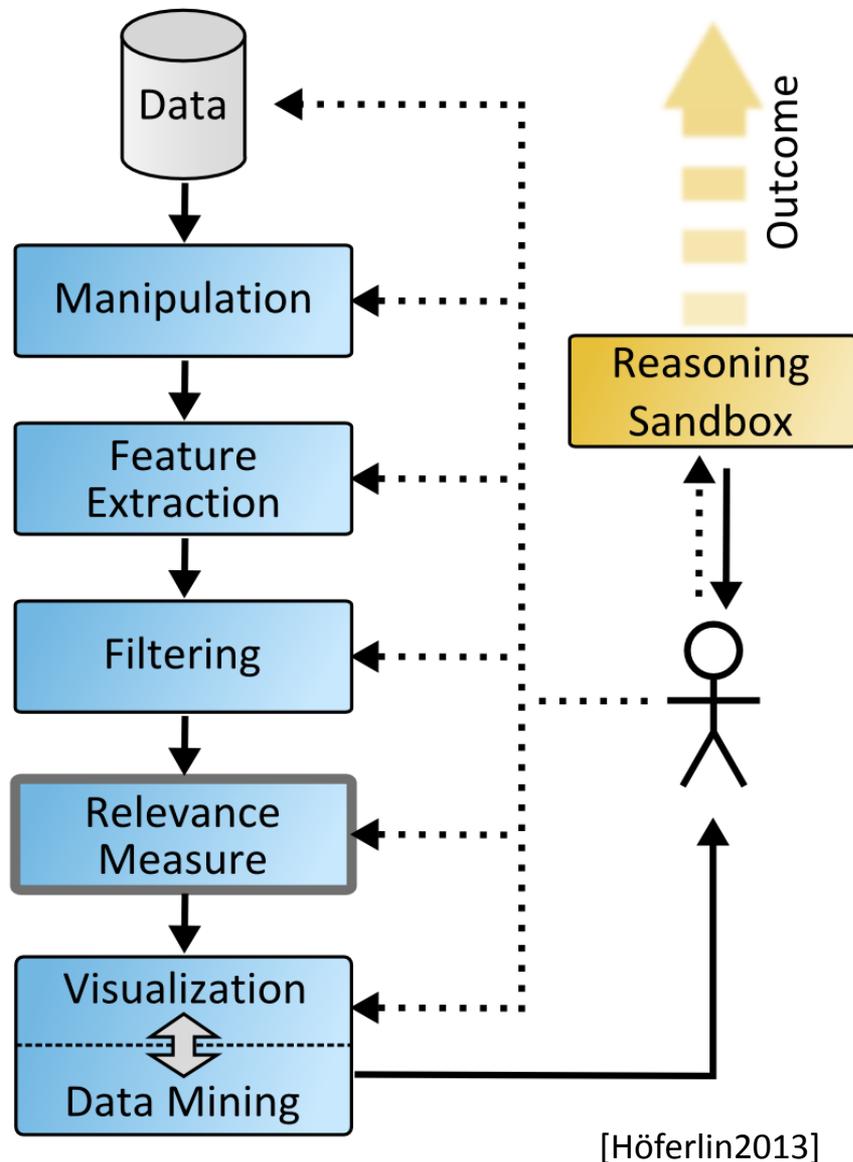
# Filtering



[Höferlin2013]

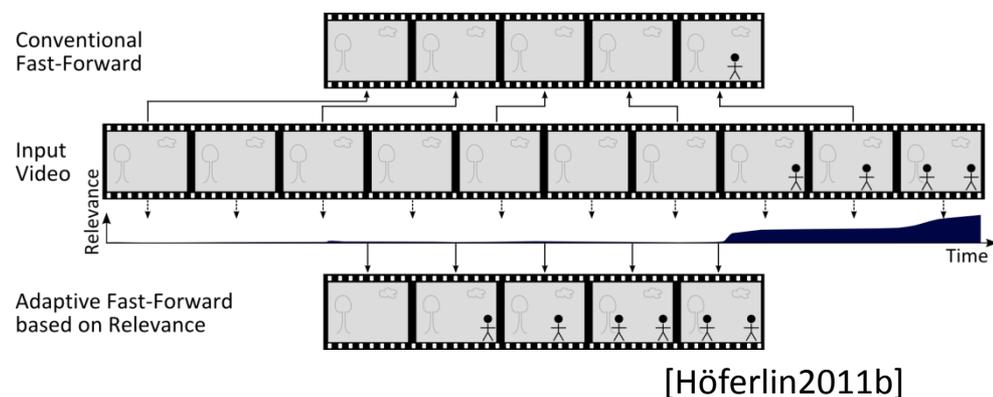
- Filtering
  - Data reduction
- Interaction guidelines
  - Easy-to-use filter definition
  - Confidence-incorporated filter definition
  - Decision-guided filter definition
  - Filter feedback
- Filter formulation
  - By example
  - By sketch
  - By properties
- Arbitrary filter combination
  - Filter graph

# Relevance Measure

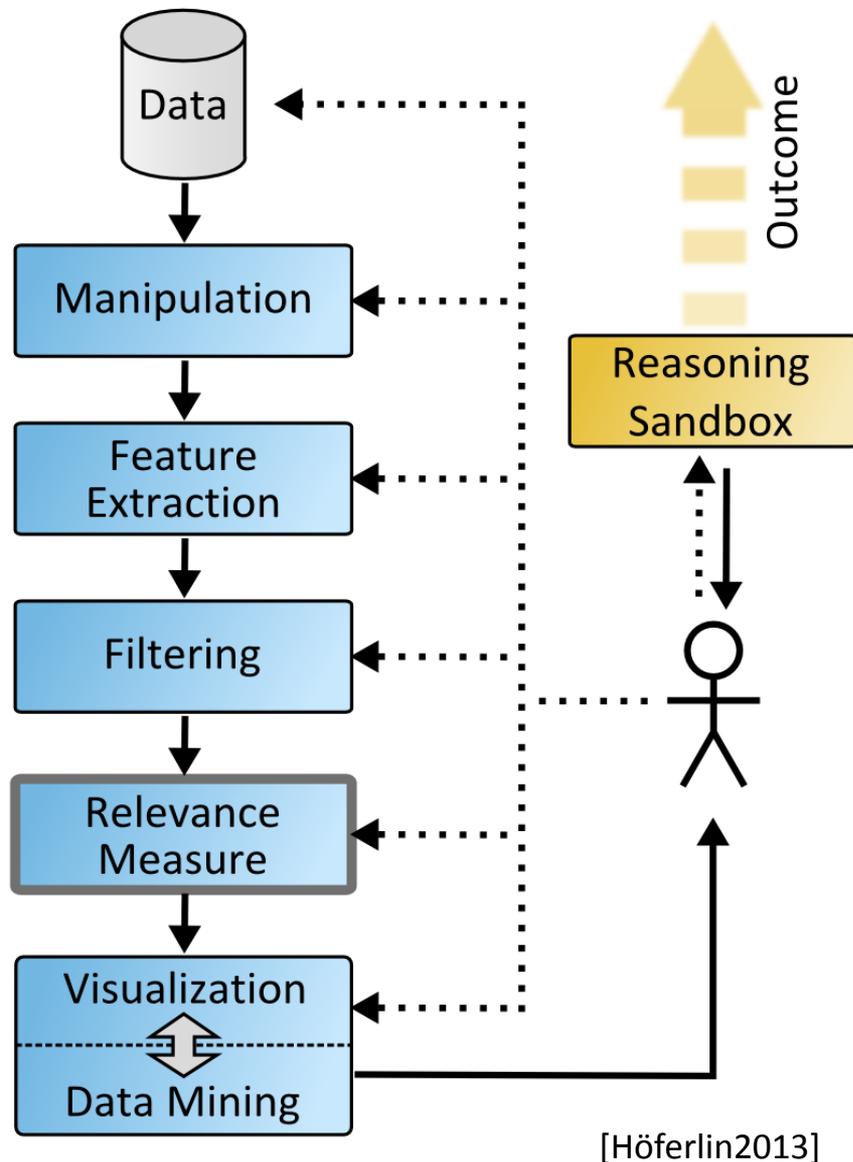


## ■ Relevance Measure

- Assignment of relevance to data elements (video frames, trajectories, ...)
- Applications
  - Adaptive fast-forward

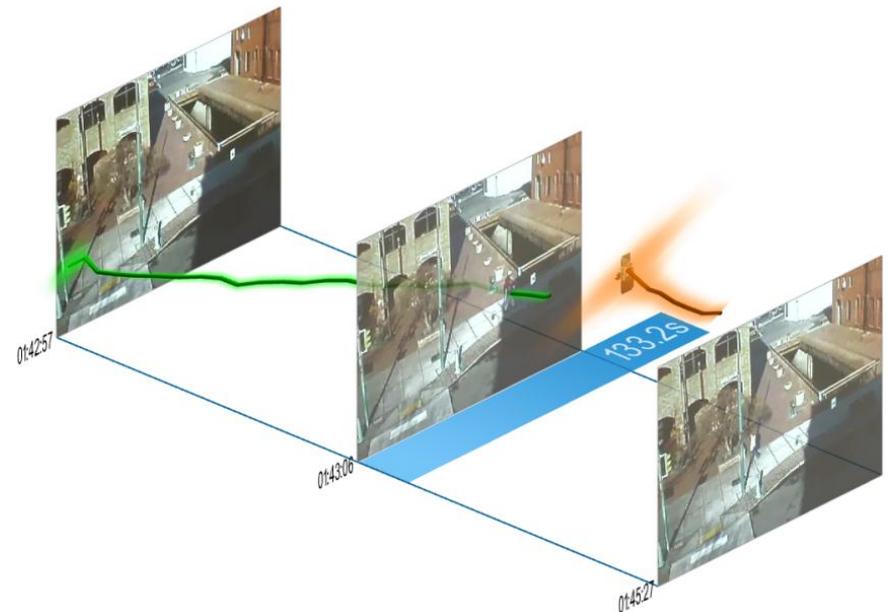


# Relevance Measure



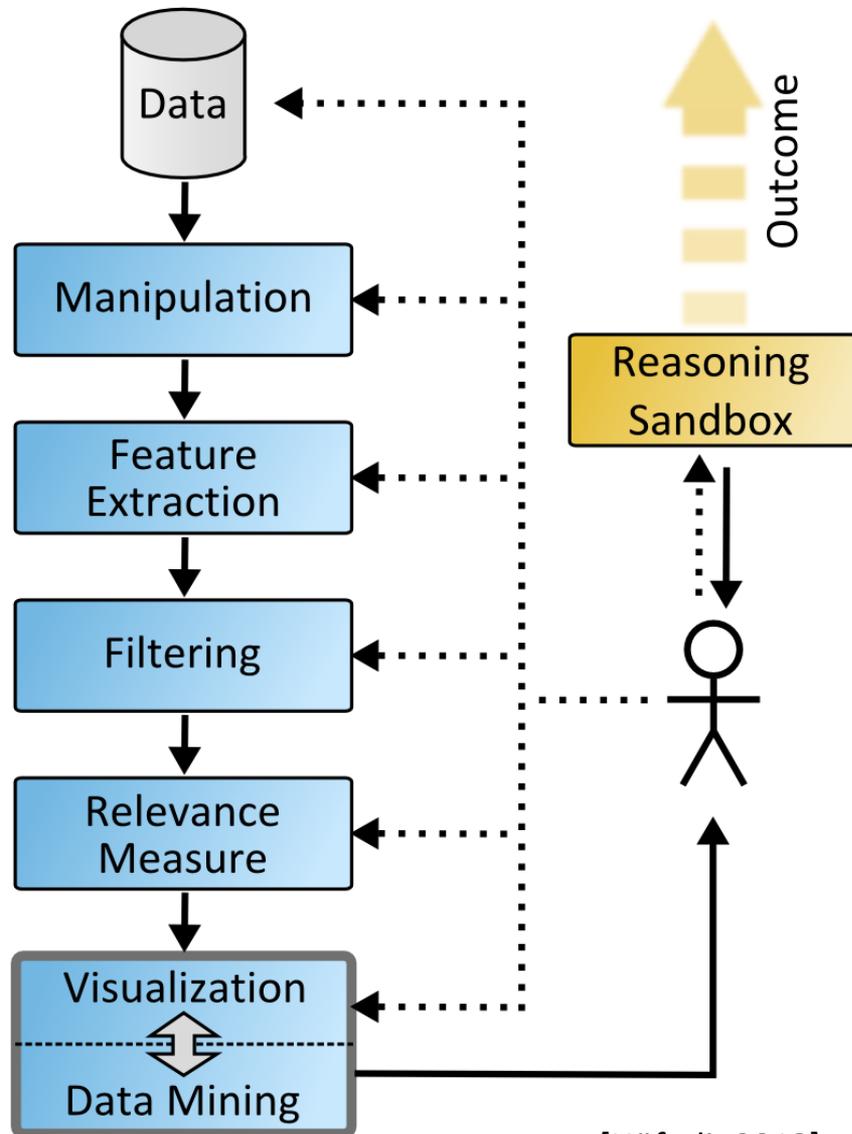
## ■ Relevance Measure

- Assignment of relevance to data elements (video frames, trajectories, ...)
- Applications
  - Adaptive fast-forward
  - Visual mapping (visualization)



[Höferlin2011]

# Visualization

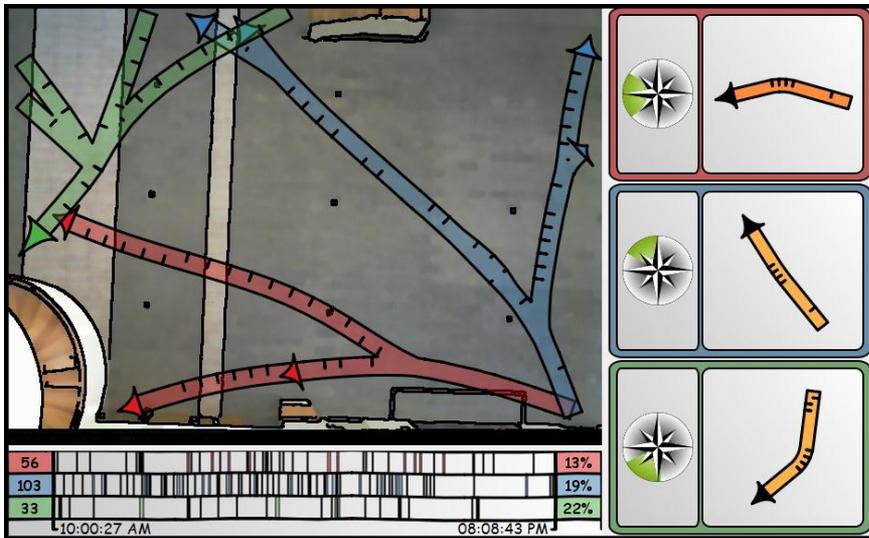


[Höferlin2013]

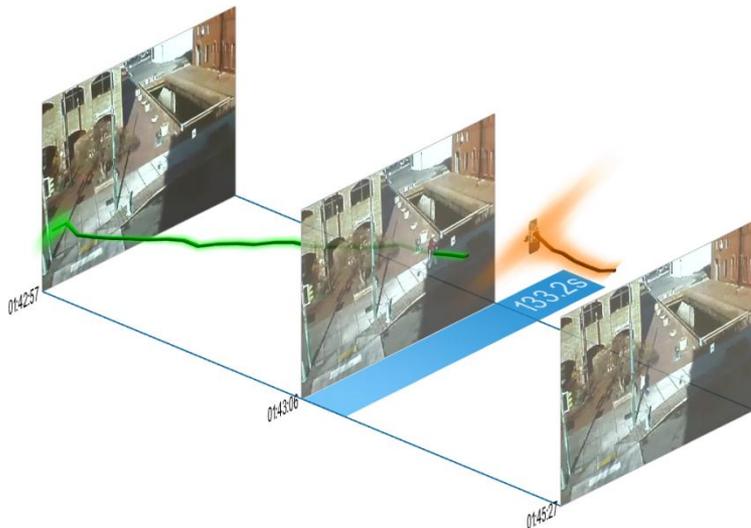
## ■ Visualization

- Multiple coordinated views
  - Complementary perspectives
  - Synchronized
- Visual data mining
- Aggregation

# Visualization



[Höferlin2013b]



[Höferlin2011]

- Visualization
  - Multiple coordinated views
    - Complementary perspectives
    - Synchronized
  - Visual data mining
  - Aggregation
- Interactive Schematic Summaries
  - Video exploration
  - Scatter/Gather of trajectories
  - Schematic summarization
- VideoPerpetuoGram
  - Dynamic video volume visualization

# Visualization



Frame-skipping



Temporal Blending



Object Trail Visualization



Predictive Trajectory Visualization

[Höferlin2012]

## ■ Visualization

- Multiple coordinated views
  - Complementary perspectives
  - Synchronized
- Visual data mining
- Aggregation

## ■ Interactive Schematic Summaries

- Video exploration
- Scatter/Gather of trajectories
- Schematic summarization

## ■ VideoPerpetuoGram

- Dynamic video volume visualization

## ■ Fast-forward visualization

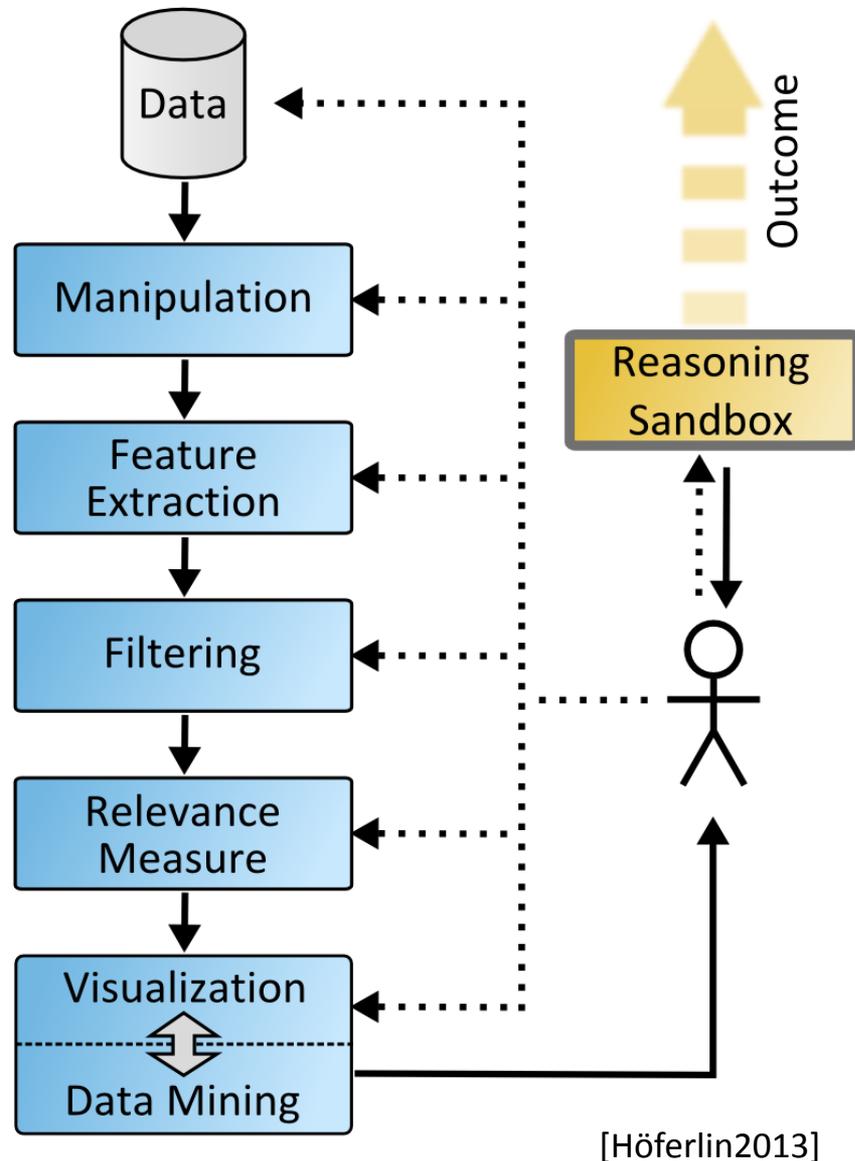
## ■ Sonification

- Situational awareness



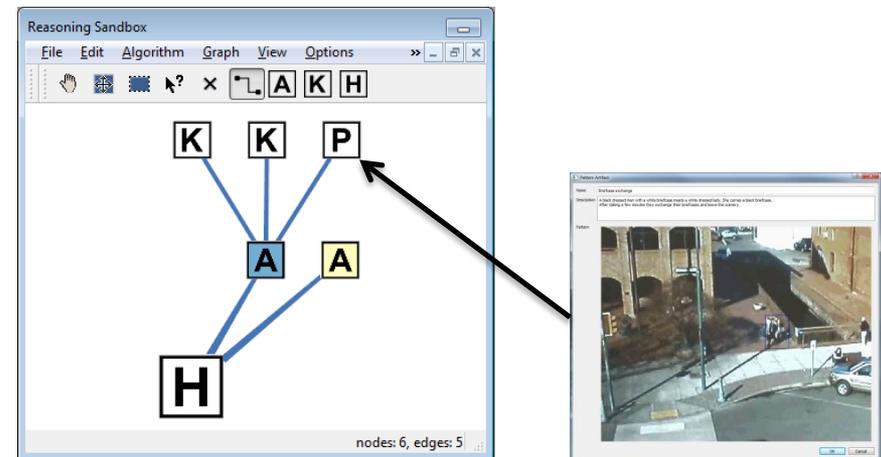
[Höferlin2011c]

# Reasoning Sandbox



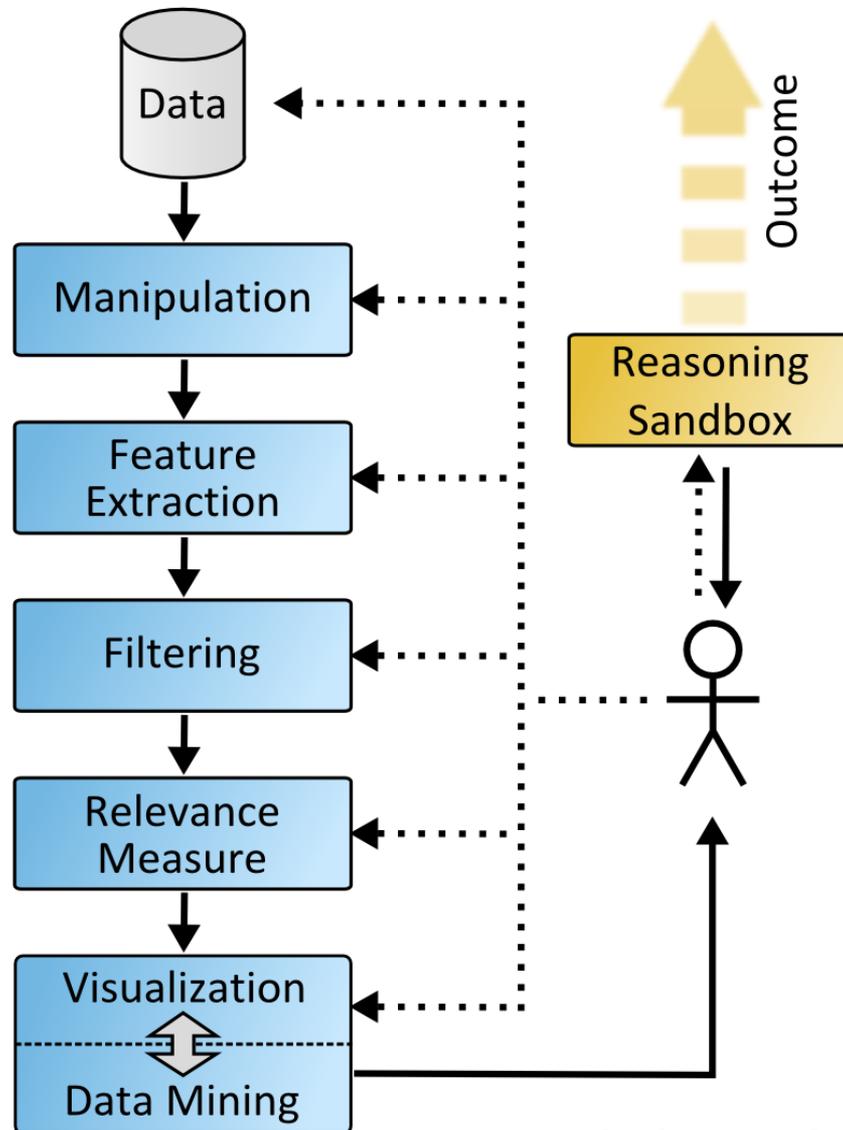
## Reasoning Sandbox

- Support of analytic discourse and sense-making
- Organization and integration of reasoning artifacts



[Höferlin2013]

# Conclusion



[Höferlin2013]

# Literature



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