

USC Viterbi School of Engineering

#### An Introduction to Workflows and WINGS

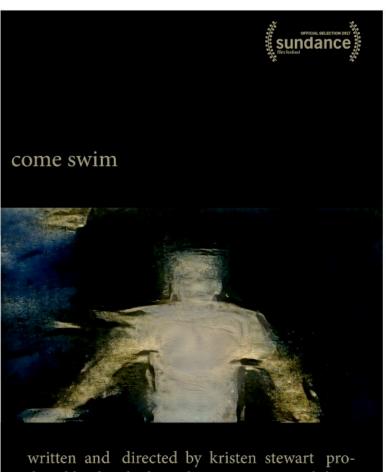
#### Yolanda Gil

Information Sciences Institute and Department of Computer Science University of Southern California http://www.isi.edu/~gil @yolandagil gil@isi.edu



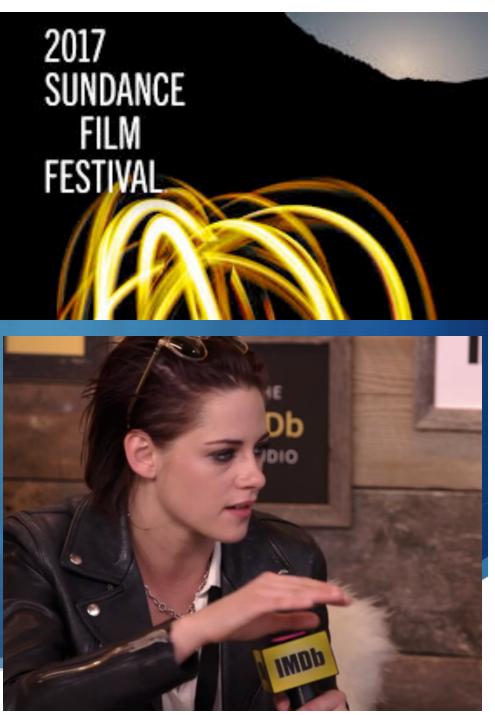


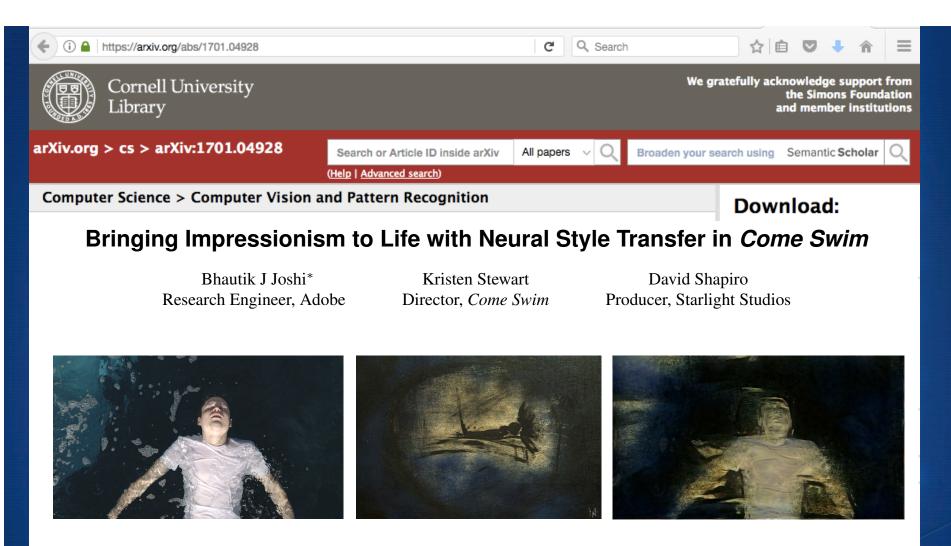




duced by david ethan shapiro starring josh kaye sydney lopez executive producers michael pruss shannon gibson amy emmerich director of photography john guleserian music by st vincent







**Figure 1:** Usage of Neural Style Transfer in Come Swim; left: content image, middle: style image, right: upsampled result. Images used with permission, (c) 2017 Starlight Studios LLC & Kristen Stewart.

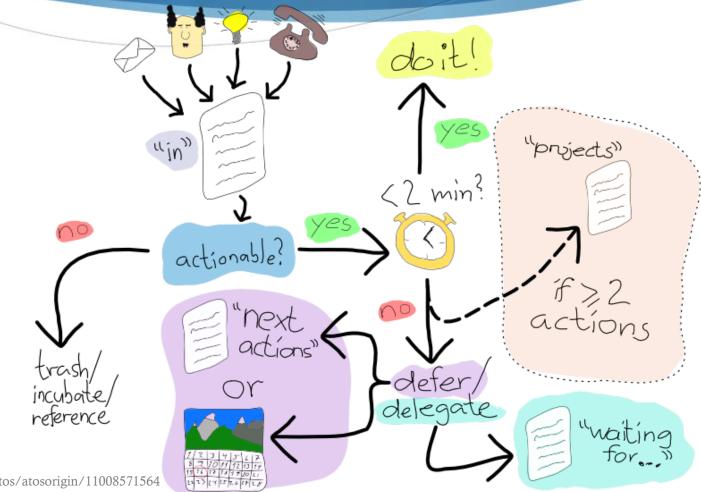
#### Abstract

Neural Style Transfer is a striking, recently-developed technique that uses neural networks to artistically redraw an image in the style of a source style image. This paper explores the use of this technique in a production setting, applying Neural Style Transfer to redraw key scenes in *Come Swim* in the style of the impressionistic painting that inspired the film. We document how the technique execute efficiently and predictably. In a production setting, however, a great deal of creative control is needed to tune the result, and a rigid set of algorithmic constraints run counter to the need for this creative exploration. While early investigations to better map the low-level neural net evaluations to stylistic effects are underway [Li et al. 2017], in our paper we focused on examining the higher-level parameter space for Neural Style Transfer and found a set of working shortcuts to map them to a reduced but meaningful



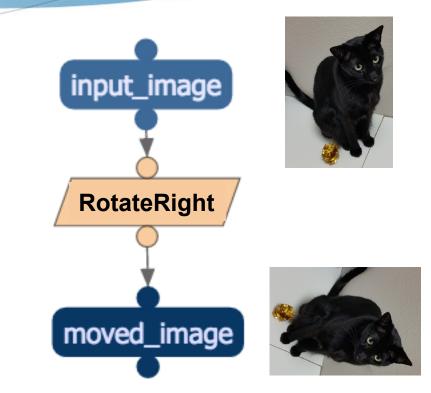
- 1. Computational workflows
- 2. Benefits of using workflows
- 3. Workflow systems
- 4. Semantic workflows

# "Workflow" Is a Common Term to Denote Organized Activities

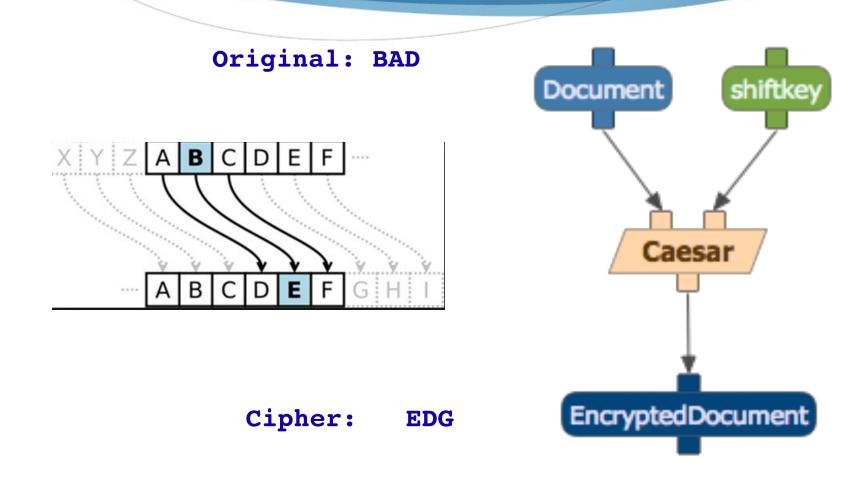


# Treating Workflow Components as "Black Boxes"

- You don't have to understand the inner workings in order to use the component
- This is why we often refer to software as a "black box"
- You do need to understand inputs/outputs/parameters and the program's function



#### Components as Black Boxes



## Software for Data Analysis

1) Commercial statistical packages
SPSS
SAS

Stata

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(Excel)

MATLAB

Mathematica

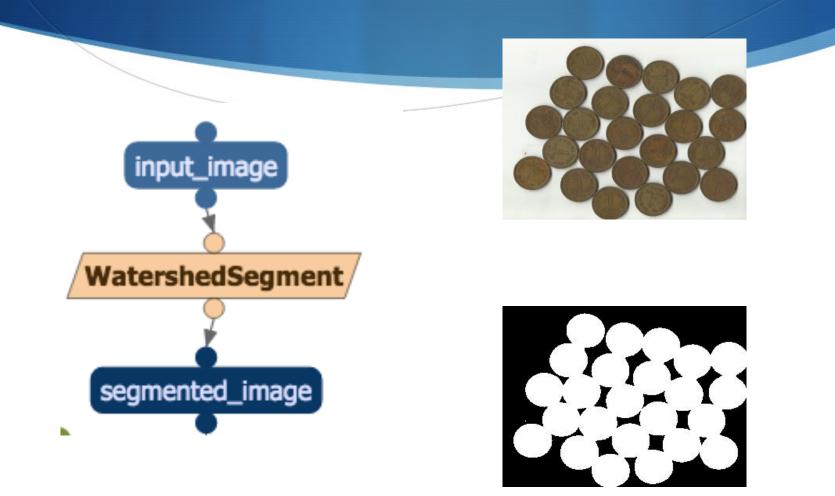
2) Open source (free) software

- R package
- Python libraries
- OpenCV for image processing
- NLTK for text processing

3) Custom software
Scripts
Functions built by
developers
...

 Can create workflow components by exposing a function (i.e., a command line invocation)

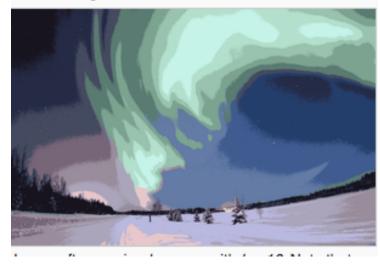
## Segmentation



## Segmentation



Source image.



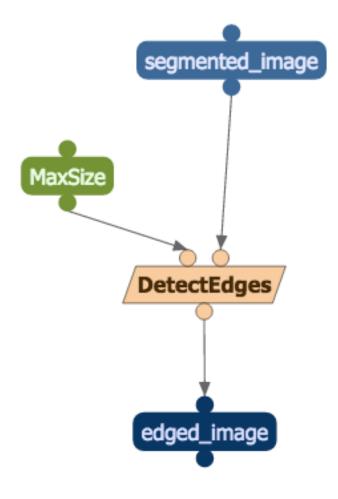


Dividing an image into regions

 Each region contains "similar" pixels

 Useful for detecting objects

#### Edge Detection

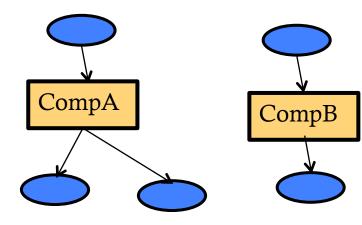


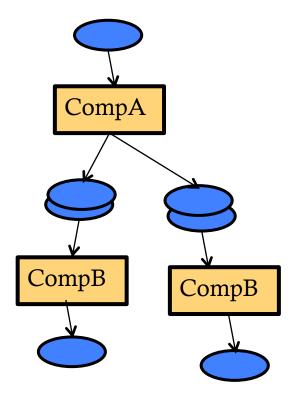




https://en.wikipedia.org/wiki/Edge\_detection#/media/File:%C3%84%C3%A4retuvastuse\_n%C3%A4ide.png

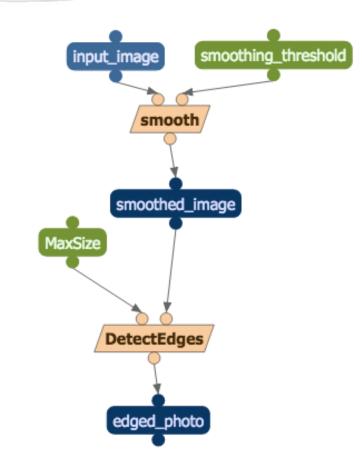
# **Composing Functions**





#### **Computational Workflows**

A computational workflow is a composition of functions implemented as software components





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## Simple Programming Paradigm



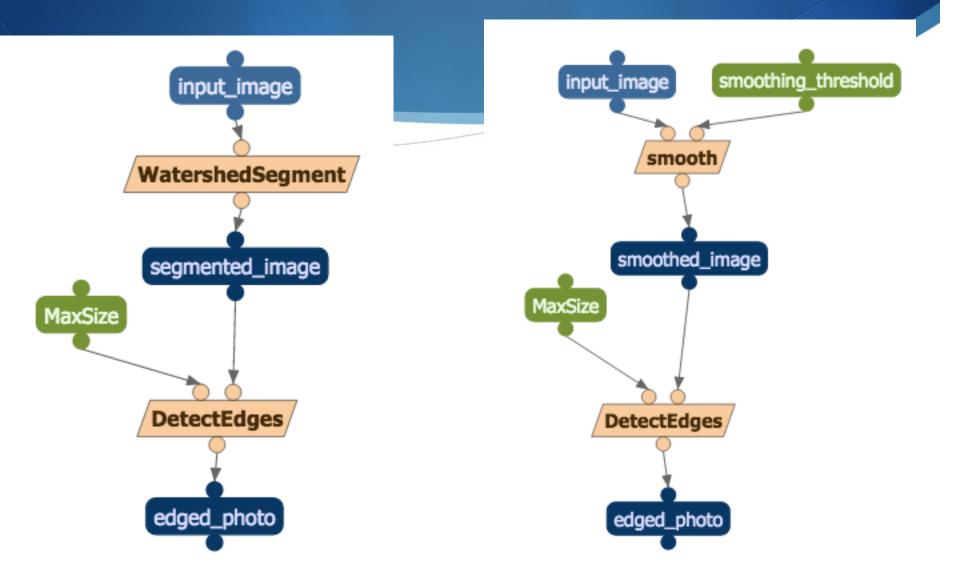




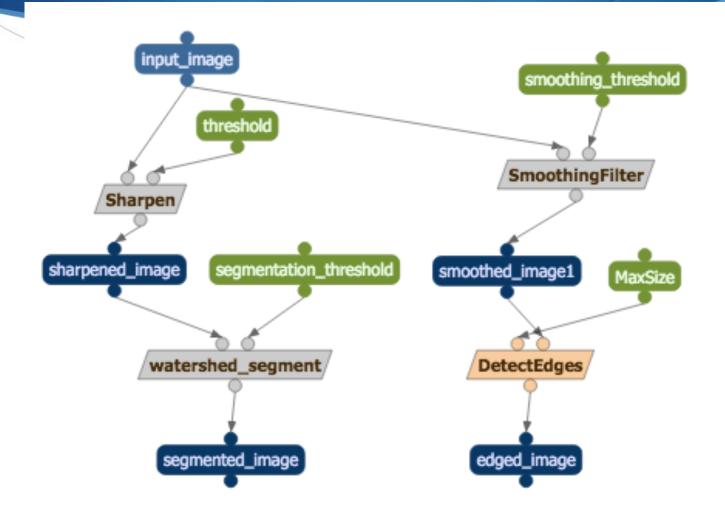


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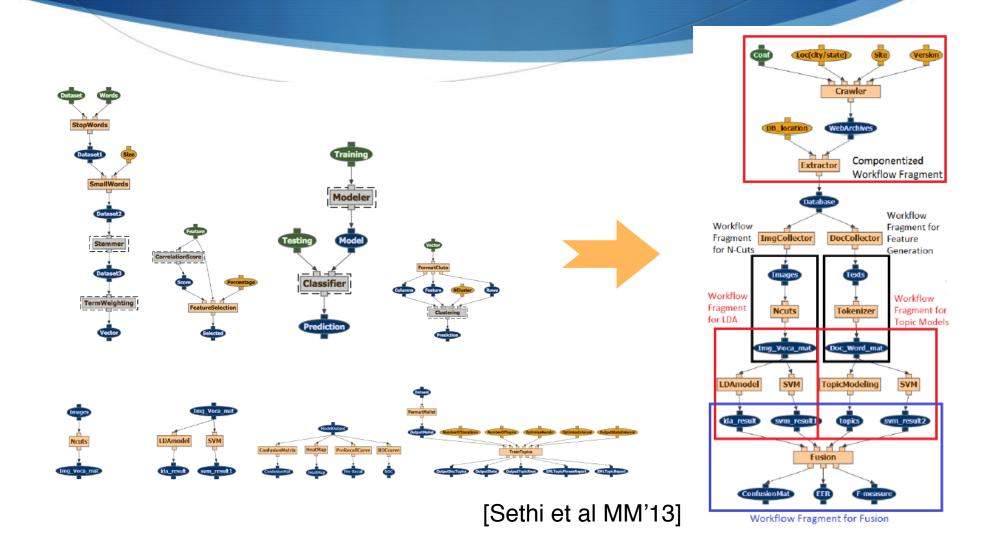
# Many Compositions to Try



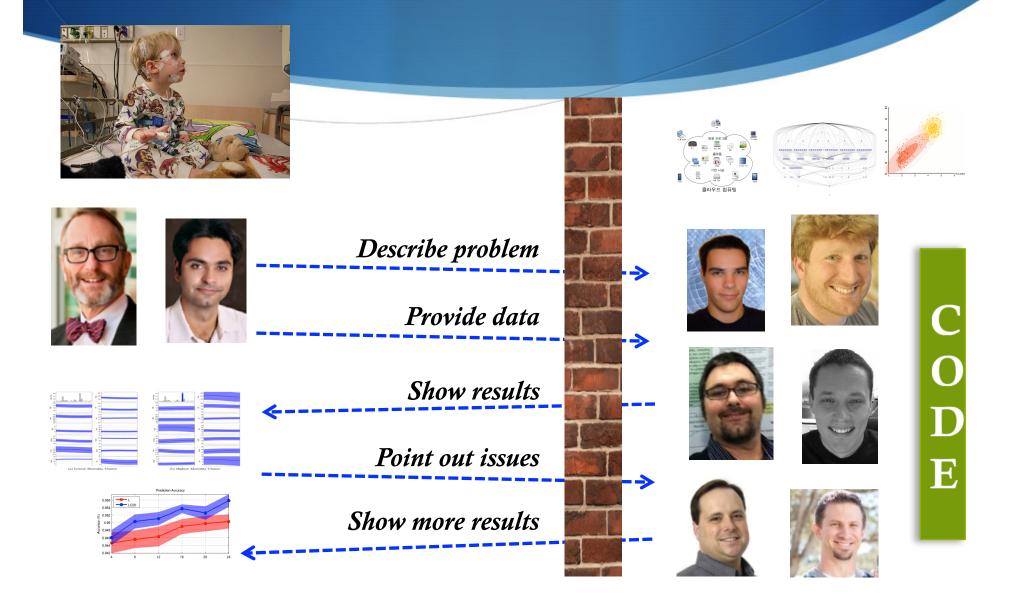
#### More Complex Compositions



#### Modular Assembly



#### Facilitating Communication Across Data Science Expertise Areas



# Data Science Teams: 1) The Domain Experts





#### Data Science Teams: 2) Semantics and Data Integration Masters







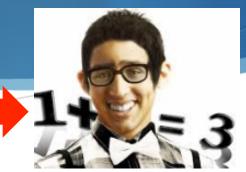


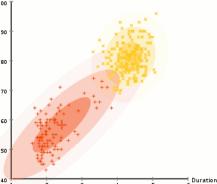


# Data Science Teams: 3) The Math Whizes









1 2 3 4 5 6

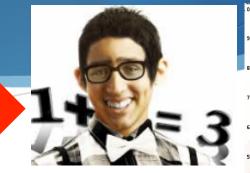


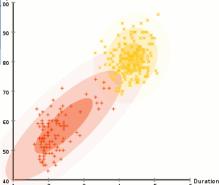


# Data Science Teams:4) The Scalability Hackers









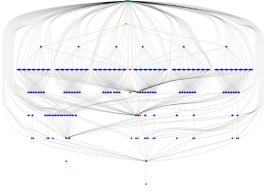










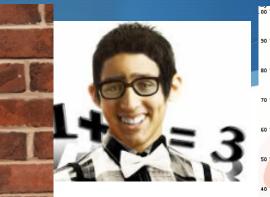


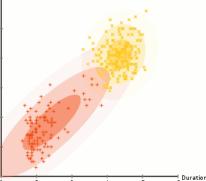
#### **Distinct Expertise in Data Science**





Domain knowledge





#### Statistics, data mining



#### Semantics and data integration

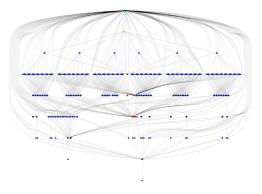




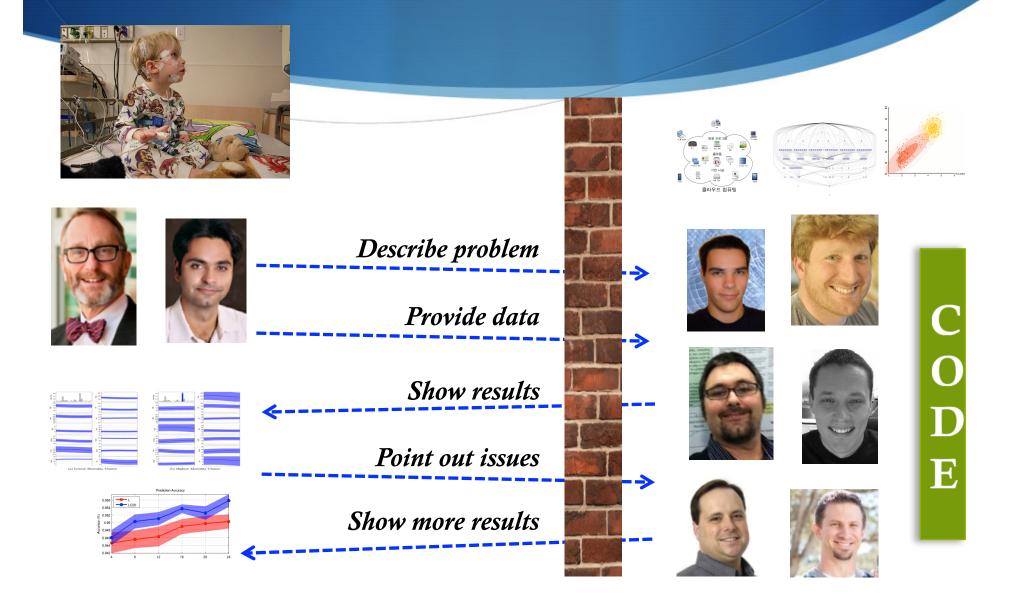


#### Large-Scale Data Processing



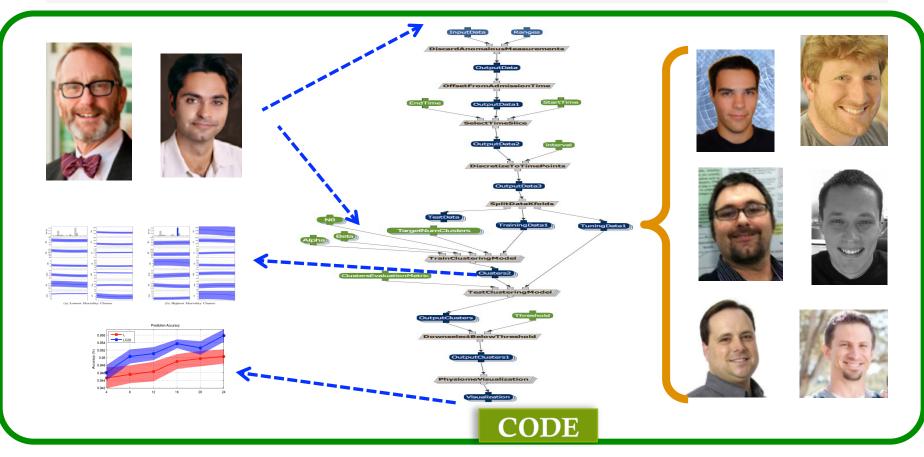


#### Facilitating Communication Across Data Science Expertise Areas

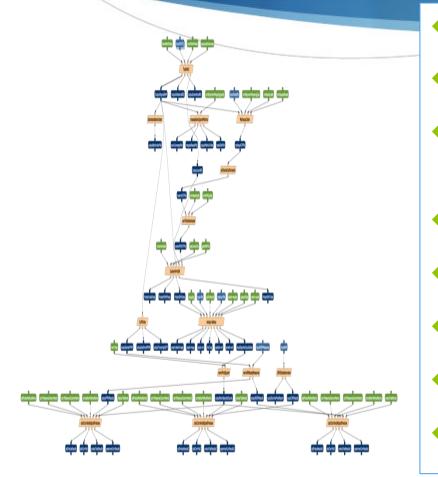


# ICU Patient Clustering [Marlin et al IHI'12; Kale et al '13]

End users can easily and continuously explore the data by running the workflow themselves, trying out different data and different parameter values



## Benefits of Using Workflows



- Simple programming paradigm
- Modular assembly
  - Facilitating communication across data science expertise areas
  - Composing heterogeneous code
- Data preparation steps
- Data visualization steps
- Provenance and reproducibility
- Large-scale processing



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#### Workflow Systems

Many choices
 Academic prototypes
 Operational open source
 Commercial

- Each has different capabilities
  - Scalable computations
  - Domain components
  - Data visualizations



#### WINGS http://www.wings-workflows.org



🐵 Wings Portal

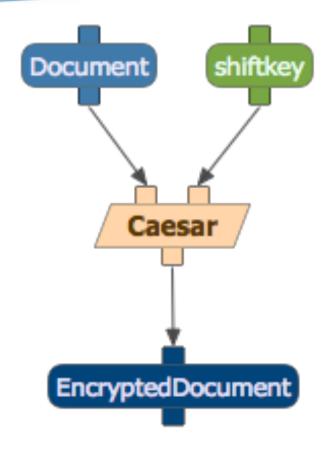
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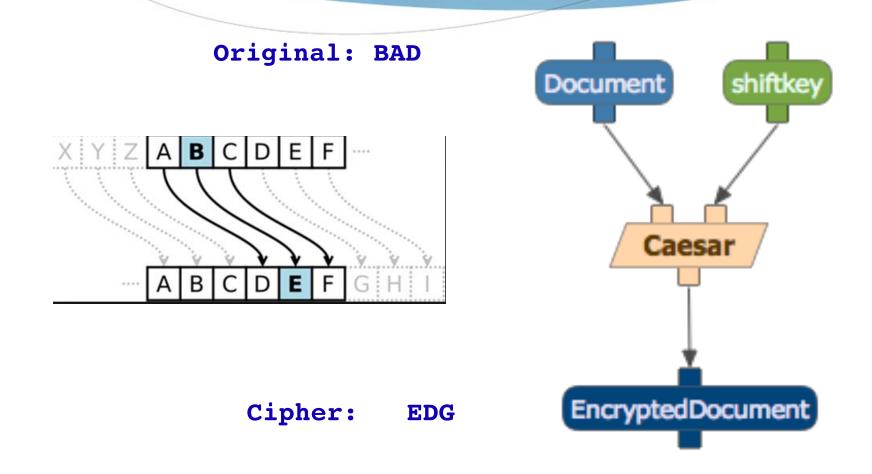
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# Workflows Treat Software Components as "Black Boxes"

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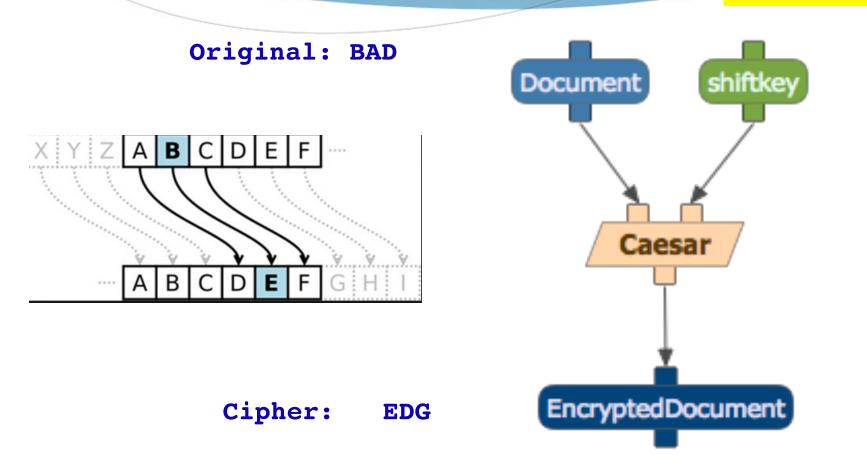


# Sometimes There Are Important Constraints



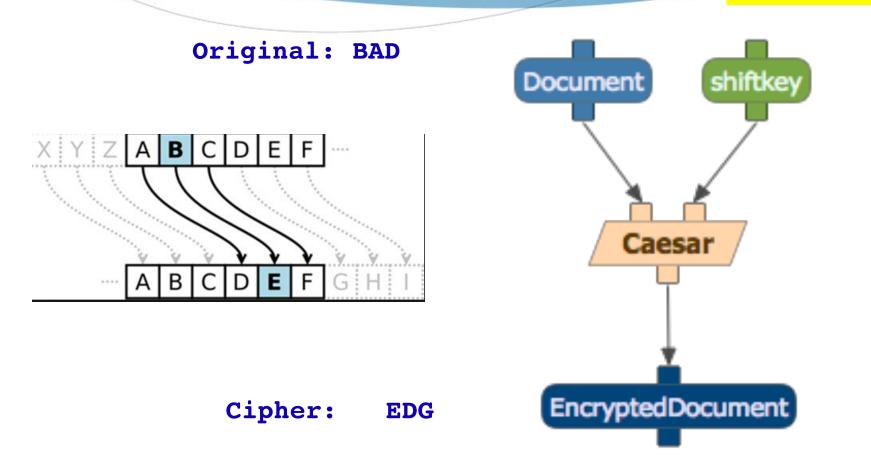
# Sometimes There Are Important Constraints

Shiftkey should not be 26



# Sometimes There Are Important Constraints

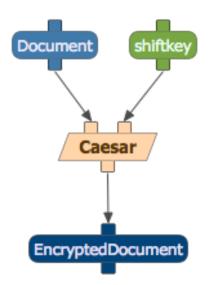
Shiftkey should not be 26, or 0



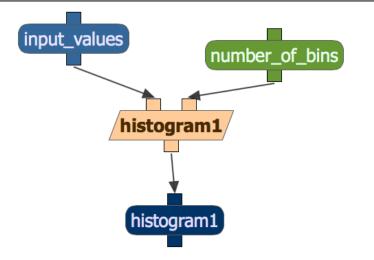
#### Semantic Components

 Semantic components include semantic constraints that express logic rules about their input or output data, parameters, or other uses of the underlying code

Validation rule: Shiftkey cannot be zero



**Parameter setting rule:** Sturges' rule suggests that number\_of\_bins be set to log<sub>2</sub>(number of data points) +1



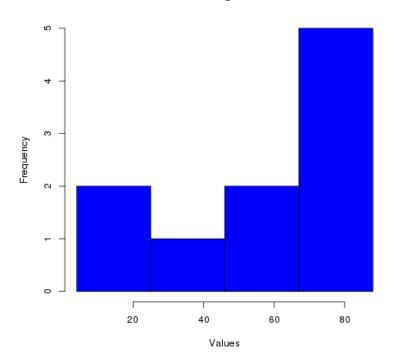
#### Semantic Constraints To Set Up Parameter Values

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↓ Data	Number of datapoints: 479 Semester: Fall Year: 2016		79	histogram1	
Course ID	Enrollment	Instructor	Open	histogram1	
549	20	A. Gold	Yes	histogram	
533	50	D. Garcia	Open		
556	25	P. Peters	Y		
521	100	J. Smith	Open		

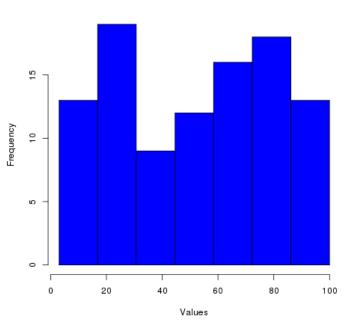
## WINGS Customizes Workflows through Semantic Constraints

The data file for this histogram has 10 data points, so WINGS automatically proposes 4 bins:

Histogram



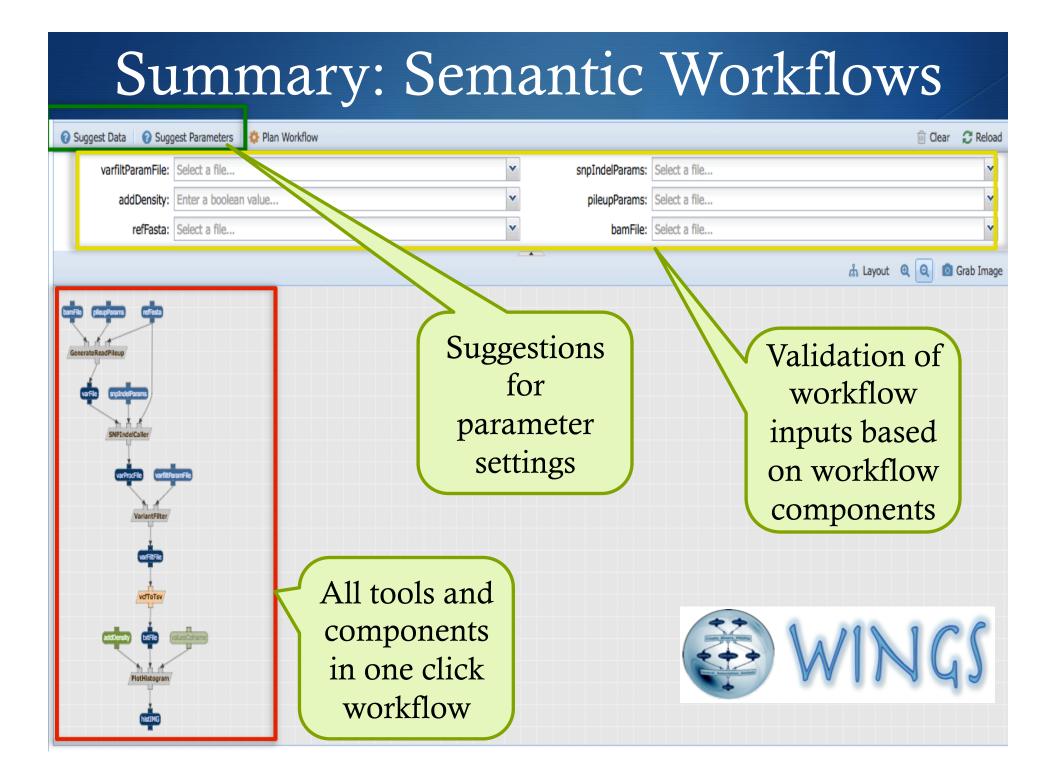
The data file for this histogram has 100 data points, so WINGS automatically proposes 7 bins:



Histogram

#### 🛞 Wings Portal

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## Conclusions

• Workflows are complex compositions of advanced data analysis software Workflows make it easy for domain experts to use advanced analytic methods Many workflow systems available • WINGS has additional capabilities to enforce important semantic constraints

http://www.wings-workflows.org