



# Developing a schedule model from a cost modeler's perspective

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All data shown in this presentation is notional

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# Introduction

## Who we are



Space Systems  
Command



Financial Management  
Cost & Earned Value  
Division



[USCM 2021  
ICEAA  
Presentation](#)



## Abstract

Cost estimators need to utilize and develop estimating methods for project components beyond cost. Schedule is one of those components. The Space Systems Command (SSC) Financial Management Cost organization, known for the development of the Unmanned Space Vehicle Cost Model (USCM), started development of a Schedule Model in 2018. This journey has yielded some exciting new methods, products, and processes. It has also brought challenges as we could not address schedule exactly as we would with cost.



## Title & Theme

*Developing a schedule model  
from a cost modeler's  
perspective*

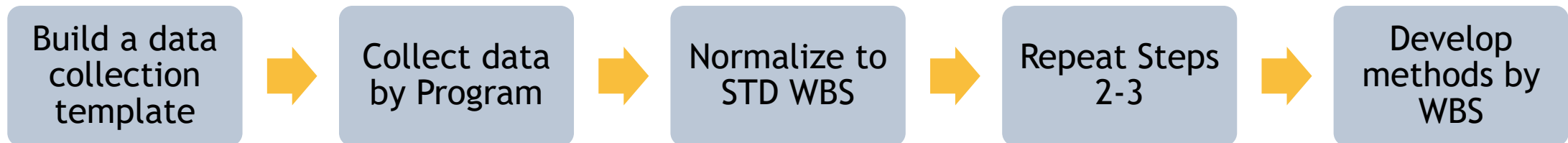


# The Cost Modeler's Perspective

## Common best practices from the cost community

- Use of data collection templates
- Utilizing techniques such as regressions for estimating
- Collecting and storing historical data
- Using the rigor of a WBS to organize data and methods
- Well established process (e.g. normalization, CER development, etc.)

## Simplified process for developing a cost model





# Uniqueness of Schedule Data



**Schedule report**  $\neq$   
**Cost report**

- A cost report, regardless of fidelity, always sums to a total -- schedules do not behave this way



**Complexity**

- Schedule data has more dimensions and parameters associated with each date or duration which make each “data point” more complex than the equivalent “cost data point”



**“Complete” schedules  
don't exist**

- Schedules will often drop milestones after they have passed making collection more challenging whereas cost reports retain all elements from start to finish
- No single authoritative source exists for schedules

*Terminology: SRA = Schedule Risk Analysis, IMS = Integrated Master Schedule*



# Agenda

Section	Presentation	Paper
✓ Background	X	X
<input type="checkbox"/> Development Approach		X
<input type="checkbox"/> Model Overview	X	X
<input type="checkbox"/> Estimating Model <ul style="list-style-type: none"><li>• Data Collection</li><li>• Data Storage</li><li>• Methods</li></ul>	X	X
<input type="checkbox"/> Schedule Summarization		X
<input type="checkbox"/> Task Search	X	X
<input type="checkbox"/> Conclusion	X	X

- This presentation is a high level overview of the paper
- Recommend reading the paper for a more comprehensive description
- Lessons Learned shared throughout both presentation and paper



# Schedule Model Overview

Elements of the Model	End Users	Benefits
<b>Schedule Estimating Model</b>	Cost estimators	<ul style="list-style-type: none"> <li>Data driven methods used to phase cost estimates</li> <li>Data driven uncertainty for schedule inputs/assumptions in cost estimates</li> </ul>
	Schedulers	<ul style="list-style-type: none"> <li>Data driven uncertainty bounds in SRAs</li> </ul>
<b>Schedule Summarization Framework</b>	Schedulers	<ul style="list-style-type: none"> <li>Consistent means of summarizing an IMS (for SRAs)</li> </ul>
<b>Schedule Task Search</b>	Cost estimators	<ul style="list-style-type: none"> <li>Faster data collection to develop Schedule Estimating Relationships</li> </ul>
	Schedulers	<ul style="list-style-type: none"> <li>Access to historical analogous tasks similar to tasks on the critical path (for SRAs)</li> </ul>

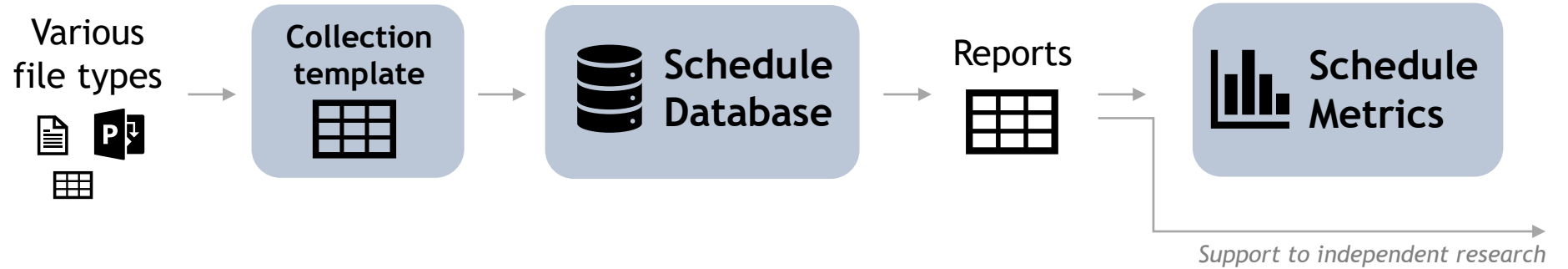
## Objectives

- Provide data driven approaches for addressing schedule analysis
- Develop better processes for utilizing schedule data

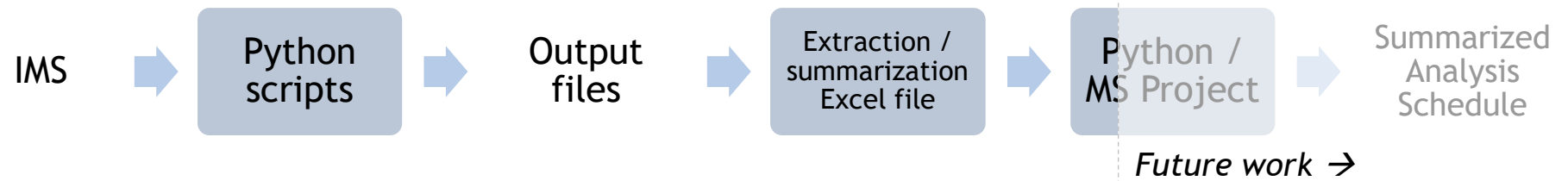


# Schedule Model Overview (cont.)

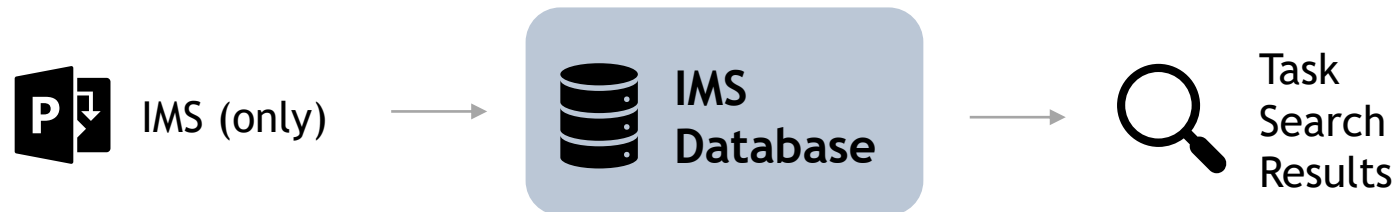
## Schedule Estimating Model



## Schedule Summarization Framework



## Schedule Task Search





# Collecting Schedule Data

Lesson Learned: Data collection needs to be focused around the desired metrics



## Process for identifying & collecting schedule data

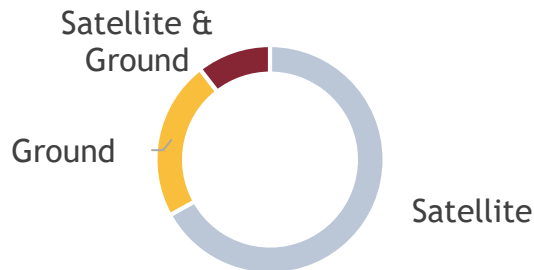


## Template Statistics

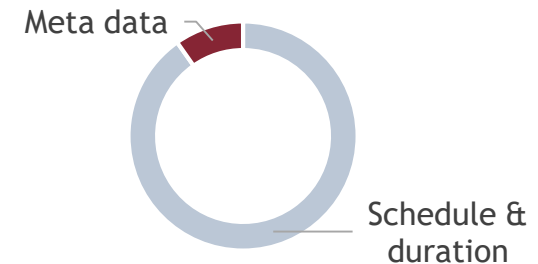
# 124

Parameters

Database will calculate add'l fields based on these parameters



Breakout of Satellite vs Ground system parameters



Schedule data is not the only focus.





# Data Collection Template Headers

## About

- Data collection template captures schedule and related meta data
- Status: Continually evolving

**Lesson Learned: Data sourcing needs to be very rigorous**

Specificity in data collection is required

Field name	Example
type description	Launch
Value	1/1/2023
Original_name	Launch Date
Date Type (B = Baseline / F = Forecast / A = Actual)	F
Date Accuracy (P = Precise / E = Estimated)	E
Source document	ABC IMS Schedule SV 1 Consolidated Jan 2022.pdf
Date of source	1/31/22
Notes	Day is estimated. Only month and year are known.

*Data shown is notional*



## About

- Used to store data captured using the data collection template
- Provides reporting that corresponds with desired metrics

696

Programs

6956

Dataset Rows

### Data Maintenance

#### Data Maintenance:

Program Description	Data entry for Program descriptions
Program Viewer	View Meta Data
Bulk Import	Import multiple records within an excel file
Data Clean Up	Review/validate multiple entries for milestones
Data Validation	Validate milestones that are not in correct order of occurrence
Program Name Maintenance	Validate Program Names
SSC Programs	Designate programs as SSC programs
Missing Data	Generate report of missing meta data

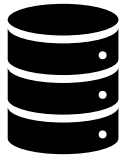
#### Template:

Export Template	Allows user to export a template file for bulk import
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*Screenshot*



# Schedule Database Lessons Learned



**Excel is insufficient for storage and reporting for this project**

- All prior schedule studies utilize Excel as data repository
- Data storage via Excel was not going to suffice given the functionality desired



**Reporting structure is hard to get right on the first try**

- Don't spent too much time on the initial report structure and incorporate a feedback mechanism in the report development process



**Data needs to be maintained**

- The Schedule Database has built-in data validation functionality to help identify holes in the data and inconsistent entries



# Schedule Methods

## About

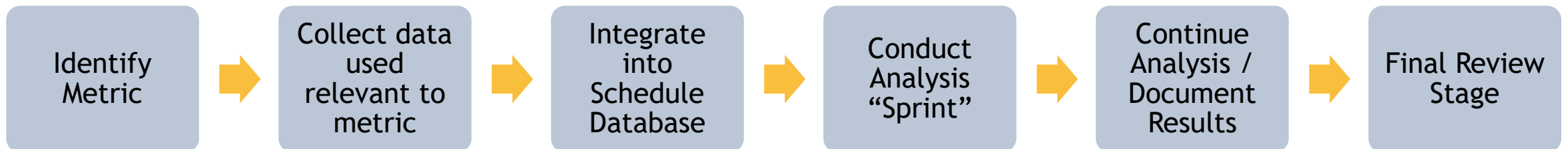
Developed 3 satellite system specific metrics with more in the queue

## Motivation

Each method seeks to provide a data driven analysis where none existed

Metric	Domain	Status
Duration between Long Lead and Production award	Space	Developed
Launch growth from baseline to actual	Space	Developed
Time between sequential launches	Space	Developed
Time between software increments	Ground/SW	In progress
Time between software deliveries	Ground/SW	In progress
TVAC related metrics	Space	Idea phase
IA&T duration	Space	Idea phase
Time to ILC or time between ILC and launch	Space	Idea phase

## Metric Development Process





# Lessons Learned in Developing Schedule Methods



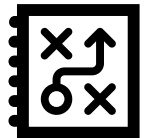
## Common Issues

- Milestones we needed to collect were not always included in our primary data source type (e.g. an IMS)
- Errors in source data



## Analysis sprints allowed us to go fast

- Enabled us to establish scope and go/no-go position early on



## Other Challenges

- Process necessitates modifications to templates and reporting
- Explanation of “why” (e.g. why did the schedule slip) was not part of scope but is a lingering element



# Schedule Task Search (i.e. IMS Database)

Database Contents Overview

USCM IMS Database Upload Admin Logout

### Dataset Attributes

Number of Programs: 9

Number of Schedules: 9

Number of Tasks: 54315

Tasks by Year:

Tasks by Duration (Days):

### Task Search

Paste in a string of text, such as a task name description, that you want to find a similar task for in the database.

Flight Software Build 1 Search

Choose forecast/actuals/both tasks: Actual + Forecast | Choose a program: All | Choose milestone or all tasks: All | Score Threshold: 0.7

### Results Table

Program	Task Name	Start	Finish	Duration	Percent Complete	Schedule	Score
	1 Flight Software Build 1						100
	Flight Software Build 1						100
	Flight Software Build 1						100
	Flight Software Build 2						96
	Flight Software Build 3						96
	Flight Software Build 4						96
	Flight Box Build,						75



## Purpose

Provide rank ordered schedule task name search results



## Technologies

Python Machine Learning  
Django NLP



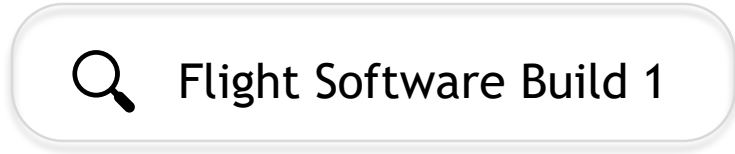
## Status

Prototype

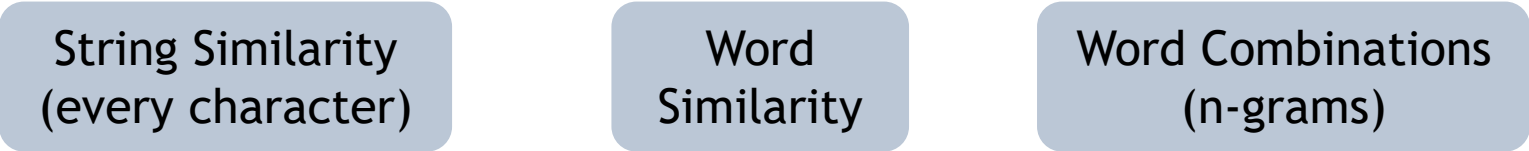


# The Engine in Search Engine

1. User searches on a term



2. Natural Language Processing techniques are applied



3. Results from each technique are scored and ranked



4. Results provided to user to analyze

Task Name	Score
SV 2 Flight Software Build 1	100
Flight Software Build 3	96

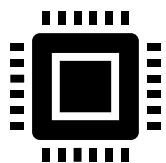


# Lessons Learned in developing search algorithms



**Search capabilities are necessary**

- Search algorithms are not a commonplace solution in the cost estimating community
- The use of search is incredibly efficient when compared to the approach of first mapping tasks to a standard structure



**Natural Language Processing can be computationally expensive**

- The computational complexity, memory requirements, and other considerations can require evaluating tradeoffs and alternate approaches to those originally developed





# Concluding Thoughts

## Summary

- Lots of (analytical) opportunities with schedule data and method development
- There are many best practices from the cost community that can be leveraged to perform schedule research
- Unique processes need to be developed because schedule  $\neq$  cost
- Recommend reading the paper to learn more about SSC's Schedule Model

## Acknowledgements

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## Way Forward

- Schedule Estimating Model: continued data collection and method development
- Task Search: Improve search algorithms and architecture; add more data
- Summarization: Optimize for faster results
- Socialize results with community



# Resources and References

- Space Systems Command (<https://www.ssc.spaceforce.mil/Connect-With-Us/Space-Systems-Command-Front-Door>)
- USCM public website ([www.uscmonline.com](http://www.uscmonline.com))
- Summarizing Schedules using Hidden Markov Models and Natural Language Processing ([https://www.nasa.gov/sites/default/files/atoms/files/07\\_machine\\_learning\\_for\\_schedule\\_summarization\\_nasa\\_final.pdf](https://www.nasa.gov/sites/default/files/atoms/files/07_machine_learning_for_schedule_summarization_nasa_final.pdf))
- USCM11 ICEAA 2021 presentation (<https://www.iceaaonline.com/wp-content/uploads/2021/06/MLD07-ppt-Kwok-USCM11-%E2%80%93-an-Evolution-of-Techniques.pdf>)