Andromeda Systems Incorporated - ASI

Reliability, Maintainability & Supportability (RM&S) Division

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Incorporating AI into Data Analytics and Visualization

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Background

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>ASI presented previous RAM Engineering projects:

- Reliability-Centered Maintenance (RCM) Analysis
- Supportability Optimization Model (SOM)
- Weibull (Life Data) analysis
- Reliability Block Diagrams (RBDs) to predict spares procurements

>RAM projects involved numerous types of physical assets:

- Aircraft (Fixed Wing, Helicopters, UAVs)
- Ground Vehicles (BFV, FMTV, LVSR)
- Facilities (Data centers, Hospitals)
- Mining Equipment (Scalers, Elevators, Conveyors)
- Other equipment (Engines, Tug Boats, S.E.)



Background

>ASI tasked with utilizing Data Analytics and Visualization tools to:

- Develop Depot and Intermediate Level Metrics of Effectiveness specific to component repair in support of Navair fleet readiness
- Include the ability to perform Root Cause Analysis
- Integrate and organize various data sources and elements into a one-stop-shop for stakeholders
- Develop Dashboards to identify areas for improvements in repair effectiveness and efficiency

> Dashboards were developed to calculate and visualize key metrics:

- Induction/Production Performance
- Adherence to Workload Standards
- Work in Progress snapshots
- Retail Health



Background

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Data Analytics help to <u>build</u> the foundations of a story

- Transforms what you see on the floor into building blocks that lead to actionable items
- Organizes and connects different elements of the story for a holistic view
- Reveals metrics and trends that would otherwise be lost in a sea of information

Visualizations help to <u>communicate</u> the story

- All stakeholders can easily derive useful information efficiently
- Ease of reporting up and down the command chain
- Dynamic visualizations empower stakeholders to perform their own root cause analysis





Data Analytics Languages

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- Choosing the best language is dependent on the application
- Structured Query Language (SQL)
 - Useful for querying, managing, and transforming simple data across relational databases
 - Easier to learn and straightforward
- Python/Anaconda
 - Flexible and customizable, but slow runtime
 - Better for general purpose programming
- R

- Can be used as a combined analytics and visualization tool
- Mostly used for statistical computing and data science
- Java, JavaScript, C/C++, MATLAB, etc.



Visualization Applications- Tableau

Awtng Equipment Man-Power

Additional Processing 87

Pending MMR Creati. 53

PQDR

Misc Dly

BER

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Routed parts

Additional processing

E&E

BER

SDR

Misc. Delay

Facilities

MMR Creation

1.98

1.78

1.48

1.36

0.98

0.88

0.55



Visualization Applications- Qlik Sense

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Visualization Applications- Power Bl

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Forecast Accuracy Dashboard

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Visualization Applications

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- >Applications allow a central location for all stakeholders to connect to
- ≻All developers can access the same raw data
 - Regular dashboard updates can be automated with direct connection to a data source
- Embedded filters allow drill down capabilities for the user
- Visualization applications have some data analytics proficiency, but not as robust as back-end apps
 - Finding a balance between back-end and front-end development is key for data processing efficiency and flexibility
- Other apps are emerging and growing as the need for Business Intelligence (BI) increases
 - Looker, Excel, Sisense, SAP Business Objects, etc.



Inputs and Data Sourcing

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Navair data is spread through several data repositories

- Deckplate, BOE, CNAF, etc.
- The DataVis Tableau server is maintained with regularly updated data that developers can connect to
- Qlik Sense has the ability to connect to Tableau
- Tableau and other applications can also accept backend code/applications

New Data Source	Search						
	Actian Matrix						
Search for Data	Actian Vector						
Tableau Server	Alibaba AnalyticDB for MySQL						
	Alibaba Data Lake Analytics						
To a File	Alibaba MaxCompute						
Microsoft Excel	Amazon Athena						
Text file	Amazon Aurora for MySQL						
JSON file	Amazon EMR Hadoop Hive Amazon Redshift						
Microsoft Access							
PDF file	Anaplan						
Spatial file	Apache Drill						
Statistical file	Aster Database						
More	Azure Synapse Analytics						
	Box						
To a Server	Cloudera Hadoop						
MySQL	Databricks						
Oracle	Denodo						
Amazon Redshift	Dropbox						
Microsoft SQL Server	Esri ArcGIS Server						
More >	Exasol						
	Firebird 3						



Go

Go

IBN

IBN

Inputs and Data Sourcing

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>Unions, Joins, and Data Blending

- The wide array of data sources from Navair necessitate unions and joins
- Focus on joining the correct columns is imperative. Know and understand the data!



Union is made of 37 tables. ①

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Inputs and Data Sourcing- Tableau Prep

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Measures of Success Approval Process

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Metrics mean different things to different people!



Analytics and visualization are only beneficial if they are useful to the stakeholder. Communication is critical!



Measures of Success Approval Process

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Example: What is Production to Plan?

- Is it what you produce compared to what you planned to produce?
- Is a scrapped item a production?
- Which customers are included? Workload types?
- Do we count over production for a specific part?
- How are interchangeable parts reflected?
- Do scrapped items affect induction to plan? How does the metric affect other metrics?

➢As metrics evolve, a monthly meeting with voting members decides what assumptions are included in the metrics, how the metric is calculated, etc.

>Agreed upon metrics are submitted for documentation and official approval.



Data Analytics Within Visualization

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Calculations are developed within the Visualization application via code and the developer's user interface.

WO Count A				🕞 Shop_Transformation_Data (Componer						
COUNTD (IF	[Ret	Cond]	=	'A'	THEN	[WO	Nbr]	END)		

Calculations can be done on the backend, but it's much less flexible to inevitable changes.

➢Parameters can act as global variables within calculations.

The calculations become the mortar to the building blocks (raw data) of the houses (visualizations).

• The houses become part of the story!



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Retail Health:





Org Code

\<u>x</u> ₹

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Late DIFM/Comp as of Aug 24, '23:

Org	Wc	HOFNIIN	Nomenclature	JobStatus	Mgmt_Cd	Mcn	Jcn	TRR	S1	DIFM Days	wpurp_faq	so_iou_qty	Member NIIN Allowances				
	65B	016800624		MQ	50	DODMERA	072202712	20	0	24	0	0					
	056	010800024	DISPLAT UNIT FLIGHT	1019	30	PERINDER	Q73202713	20	0	34	0	0	-	-			
	65B	016815620	AUDIO COMPUTER	WQ	ER	P9RM4ZE	QQ0165376	20	0	42	0	0					
	65B	016815863	COMPUTER SYSTEM\ SPECIAL	IW	SO	P9RM5JR	Q62175250	20	0	30	0	0					
	65B	016815863	COMPUTER SYSTEM\ SPECIAL	WQ	SO	P9RM4DK	Q70179364	20	0	56	0	0	Ora		Niin	Nomenclature	Member NIIN
	65B	016815999	DISPLAY UNIT\ FLIGHT INF	M5	ER	P9RM5GM	QQ0179099	20	0	31	4	0	org	016915620	015695092		Allowallces
	65B	016815999	DISPLAY UNIT\ FLIGHT INF	M9	ER	P9RM5ZT	BF1040196	20	0	21	4	0		010013020	015083082	AUDIO COMPUTER	0
	65B	016906123	COMPUTER\ DIGITAL	WQ	SO	P9RM5TX	Q73173461	20	0	24	11	0			015982109		0
	520	011783292	BRAKE\ MULTIPLE DISK	M3	SO	P9RM5VZ	BF1122A38	20	0	23	46	0			0105/1091	AUDIO COMPUTER	0
-	520	013163747	TUBE ASSEMBLY\ METAL	M3	ER	P9RM4Y4	QQ0158177	20	0	43	22	0	-				
	520	013163747	TUBE ASSEMBLY\ METAL	M3	SO	P9RM5PG	Q71207303	20	0	27	22	0					



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Organic Component Dashboard- FY22 Component Schedule Data last updated: 09/30/2022 Site Customer (Multiple values) • (AII) . FRC Asset Info NIIN: CUP: FIC: LRC: Niin (AII) + WL Type (Multiple values) -3,505 22 WIP Sched TAT Site: IWST: FIC (AII) IWST (AII) . 723 82 Avg WIP Age Avg TAT IIC Tech Class (AII) (AII) • . 7,551 64 F at Site ERP RTAT RShop (AII) . 442 3% G at Site FRC Scrap/Rate 0 Target RTAT Buffer RWR NIIN Selection RWR Scheduled Adds) Scheduled ECDs 15 Q6 Q7 **Q**8 **Q1** Q2 Q3 Q4 Q5 O RWR NIINs Only 8-0tr ERP RTAT All NIIN5 117 3,491 4,503 4,559 3,272 Forecast 4,574 3,285 3,100 3,271 Schedule by Fiscal Year Inductions to Plan (I2P) Production to Plan (P2P) **On-Time Delivery** 67% FY Ind 🖁 Ind Comp WIP Qty Late Avg RTAT On Time Scrap 13,058 Planned Production (including late) 12,020 2% 2022 13,353 77% 3,080 3,071 45 78% Planned Production 10,843 10,602 80% 313 313 3% 2021 12,943 98% 83 63% 9.527 69 100% 69 78 65% 4% 2020 14,933 8,152 60% 6,935 14.967 100% 23 23 66 74% 5% 2019 5,639 8 8 63 76% 5% 2018 14,568 100% 40% 5K 4.00 2017 13,034 100% 8 8 68 75% 5% 2.952 65 75% 4% 2016 7,777 100% 4 4 20% 1.352 2015 4,403 100% 0 0 64 81% 2% 2% 0 68 81% 2014 4,616 100% 0 Oct Nov Dec Jan Feb Mar Apr M., Jun Jul Aug Sep Oct Nov Dec Jan Feb Mar Apr May Jun Jul Aug Sep Oct NovDec Jan Feb MarApr M., Jun Jul AugSep 2013 4,240 100% 0 66 80% 2% 0 Planned Inductions Planned Production Actual Inductions Actual Production Late On-Time 96 On-Time Qty On Time Qty Late Select Risk: (AII) 66% WIP Status Work In Process (WIP) % Workable Trended Delay Data No Backorders NMCS UCOs UCOs Niin Ŧ Nomenclature Site TMS WIP Delay Desc W0 Qty Qty Late Avg Days IP Avg Days in Opn Delay Delay Desc Delay % Avg. Status Days Current WIP NAVIGATION SET, TACT FRCSW 184 Dueue 1,699 1,699 116 64 60% 40.93 Common Oueue PBL Material Delay 574 145 85 15% 13647174 FRCSE 124 574 235 Routed parts 10.10 ELECTRONIC COMPON.. FRCSW 113 014708683 FA-18 EFG 101 Routed Parts 375 375 161 224 11% 7.30 Partner material 3,505 311 140 45 4% 2.43)13024410 CONTROL ELECTRIC LI Capacity Issue 307 Manpower 104 115 115 313 234 3% 1.92 15452661 CIRCUIT CARD ASSEMB FRCSW FA-18 EFG Material Material

HAZMAT Material

Awtng Equipment

)utside Vendor

Man-Power

Facilities

61

60

50

50

49

61

60

49

50

49

105

546

51

223

393

62

53

21

49

182

286

285

232

218

225

Equipment

Engineering/Technical

Facilities

Storage

Outside vendor

2%

2%

1%

1%

1%

1.28

1.09

0.68

0.42

0.35

17

Continuously Pushing the Limits of Innovation, Technology & Conventional Thinking

Engines

82

81

15728827

14873454

10999690

Overdue WIF

3,496

SUPPORT, TURBINE CO...

ROTOR, TURBINE, AIRCR FRCSE

FRCSE

FRCSE



Realized Benefits

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- Stakeholders have immediate access to snapshots of their performance and can react accordingly
- Current status and future predictions are condensed to an easily digestible format
- Drill down capabilities enables the user to perform root cause analysis efficiently and narrow their efforts towards improvement
- Negotiation with customers has become more succinct with ease of access to historical trends
- Leads to better maintenance practices and scheduling, more accurate supply availability, and predictions to prepare for operations.



Using Generative AI with Data Analytics and Visualization

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- What is Generative AI?
 - Artificial Intelligence focused on creating new and original content
 - Can be used to generate text, code, charts, and other Business Intelligence assets

How can we use AI to assist in data analytics and visualization?

- Gain insights from unstructured data
- Enhance predictive modeling with advanced algorithms
- Generate "dummy" data
- Develop optimal data models
 - Automate data processing and analysis
- Produce variety of charts quickly for comparison
 - Transform complex data sets into accessible visuals
 - Customize dashboards and reports tailored to user needs





Using Generative AI with Data Analytics and Visualization

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- What software is available?
 - Tableau: Tableau Prep, Einstein Discovery, "Ask Data"
 - Qlik: Qlik AutoML, Qlik Cognitive Engine, DataRobot
 - Power BI: Azure Machine Learning, Power Automate, Natural Language Q&A
 - Alteryx
 - Data Preparation and Analytics platform
 - IBM Watson
 - Dataiku
 - ChatGPT
- How do they integrate with current Business Intelligence tools?
 - Natural Language Processing (NLP) allow users to understand complex data quickly
 - Build predictive models by analyzing historical data patterns
 - Automate Extract, Transform, Load (ETL) processes



Using Generative A- the Basics

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- Data Preparation and Cleaning
 - Automated ETL
 - Anomaly Detection
- Data Analysis
 - Automated Insights
 - Predictive Analytics
- Visual Recommendations
 - Most effective types based on data characteristics
- User Experience Optimization
 - Personalization

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Natural Language Processing



- Design Assistance
 - Template Generation
 - Color & Style Suggestions
 - Testing and Feedback
 - User Behavior Analysis
 - Sentiment Analysis
- Integration with Other Tools
 - Seamless Data Flow
 - Collaboration Features
- Ongoing Maintenance
 - Automated Updates
 - Health Monitoring



Generative AI- Realized Benefits

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- ➢Increased efficiency in data handling and dashboard development
 - Streamline data preparation
 - Reduced development time
- Improved decision making through deeper insights

- >Enhanced user engagement with potentially better visual storytelling
- Consistent data monitoring and updates
- Better accessibility to non-technical users and developers





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WLS Reduction	Dashboard	Site	▼ Tech Class All ▼					Top NIIN	Drivers			De	escending 🔻
Data Updated: 8/	/27/2023	IWST (Multiple	▼ Niin (Multipl ▼	NIIN	E F	RC	Inductions FYTD	New Inductions	FY22 DH W	LS FY23 DH V	VLS Hrs Cha	nge	YTD Hrs Change
Download WLS Data	Direct Hrs WLS Re	duction		01408663	7 FRO	SW	6	0	287	365	0		464
Direct Labor Hr WLS Re	eduction	Labor Expende	014652501 FRC SW		42	0	27	35	0		317		
-20%	-2490			01528833	8 FR(SW	2	0	680	828	0		297
-16%		-109	01445638	0 FRG	FRC SW 3		0	104	193	0		267	
-10% -8%		-30% -011	-30%-10%-10%-30%				24	1	27	37	11		262
0% -12.8% -13.9%	-11.9%	-0.1	1%	01128969	FR	C SE	14	0	30	30	0		0
FY23 FY24	FY25	- 100%	Market Basket	01447609	FRO	SW	4	0	69	133	0		256
	Cumulative Pro	gress	01447608	FR	C SE	1	0	54	32	0		-23	
Total	FRCE	FRCSE	FRCSW	01455979	7 FRG	.C SW 3		0	259	331	0		216
YTD Status -13.0% Savings \$4.920.490	s -13.0% -21.4% -10.7% -12.1%				9 FR(SW	6	0	792	828	0		216
÷ 1,020,100	Projections	5				١	Vork Orde	er Detail	s	·			
District Us Changes Carol	FY23	FY24	FY25	WO Nbr	FRC	N	IIN	Date Act Ind	Return	FY22 DH F	Y23 DH	Hrs	WLS
Direct Hrs Std	-12.8%	-13.9%	-11.9%	55347338	FRC SW	01408	86637 1	0/20/2022	Δ	287	365	0	77
Avg. Direct Hr WLS	37.5	47.9	49.0	55547556	TREST	01-100		0/20/2022	~	207		<u> </u>	
ABP	\$5,171,472	\$8,758,515	\$7,960,636	55381140 FRCSW (V 014086637		12/1/2022	A	287	365	0	77
Component Unit Price (CUP)	-0.7%	-9.6%	-8.0%	55472648 FRC S		SW 014086637		1/25/2023	IP	287	365	0	77
ABP	\$454,591	\$21,291,226	\$20,488,541	55472751 FRC S		CSW 014086637		2/15/2023	IP	287	365	0	77
Support Hr Std	-4.0%	13.4%	14.6%	55680473	FRC SW	01408	86637	4/19/2023	IP	287	365	0	77
ABP	\$437,164	-\$2,012,665	-\$2,377,251	55690049	EDC SW	01400	06627		ID	297	265	0	77
Material Std	-0.9%	-25.8%	-25.2%	55060946	FRCSW	01400	00057	0/22/2023	IP	207	505	0	
Avg. Material WLS	\$11,236	\$14,680	\$14,511	55586331	FRC SW	01465	52501 3/21/202		IP	27	35	0	8
ABP	\$580,040	\$25,051,443	\$26,168,756	55586334	FRCSW	0146	52501	3/21/2023	Δ	27	35	0	8
Stabalized Rate Avg. Stabalized Rate	11.6% \$166	13.1% \$168	13.1% \$168	20000001		02.00		5/21/2023	A			-	
ABP	-\$5,734,086	-\$10,506,067	-\$11,263,599	55586336	FRC SW	01465	52501	3/6/2023	A	27	35	0	8
Number of Inductions	5,721	6,915	8,558	55586337	FRC SW	01465	52501	3/10/2023	А	27	35	0	8
	*FY23 Projections based on actual to date a	nd remaining I2P Plan											



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25





0

0

200

400

600

RTAT

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Work Order Effectiveness Drilldown Dashboard



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Barriers

Capability Establishment Projects

Q FRC	Q. Site	A/E/C	a a TMS	C Series	A New CE A Y/N	Q	Q, PN	Q, FSC	FSC Q Description	Q	Q, ECD	Q, R/Y/G	Q. Barrier	COMMENTS	Project split, limited repair and overhaul both being worked simultaneously	Training started 1/22/2024 with Demo ECD JULY/2024. ICPs ECD Aug 2024.	
FRCSE	Jax	С	E2/C2	D	-	3211185	123AM5 1	1680	TBD	Actuator Assembly, Aileron, Droop	FY23/Q4	G	-	Declaration l			
FRCSE	Jax	С	F-5	F-N	-	14191090	14-23010- 701	TBD	TBD	F-5 Wing	FY25/Q4	Ŷ	Awaiting Funding	Project unfu awaiting PM, confirmatior		OEM training delayed due to contract. NO contract	
FRCSE	Jax	С	F-5	F-N	-	14191091	14-23010- 703	TBD	TBD	F-5 Wing	FY25/Q4	Y	Awaiting Funding	Project unfu awaiting PM confirmatior	OEM evaluating test equipment for repairs. Training scheduled 8/2024. Corona working	date from Lockheed Martin, on-hold. Training/Demo	
FRCSE	Jax	С	F-18	E-F	-	010881539	614772-8	TBD	TBD	Valve, Venturi & Shut Off (Red)	FY24/Q4	G	-	CE workshee finalizing QR	ICPs, waiting on OEM to answer RFI.	Completed 6/2023, waiting on OEM final CMMs to complete CAP	

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Continuously Pushing the Limits of Innovation, Technology & Conventional Thinking



NAVSUP

support

/WECD:

lul/Aug 2024 - Tra.

engineering

Establishm-

ent discont-

inued base

PMA 226