

Structural Analysis of Mechanical Defect in Solid Propellant Grain Using Machine Vision & Artificial Intelligence



Collins Aerospace
An **RTX** Business

Sandip Suman, PhD (Principal Engineer)

Date: 7/12/2024

PRESENTER BIO

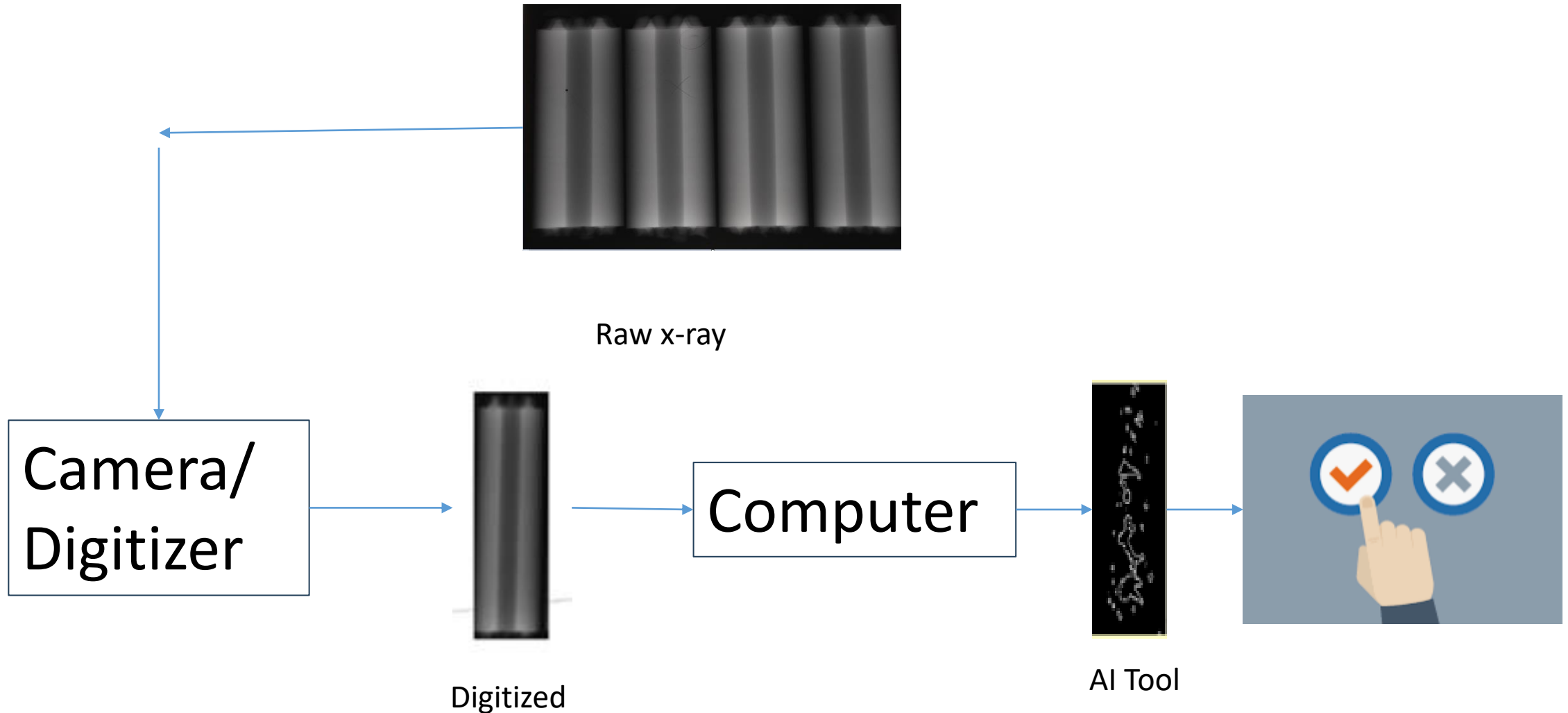
- Sandip Suman has been working as a Principal Engineer at the Ejection & Propulsion division of Collins Aerospace (A Raytheon Company) for the last seven years. He has a PhD in Mechanical Engineering with around 25 years (academia & industry combined) of engineering experience.
- Prior to Collins, Dr. Suman worked in the automotive industry for 7 years, and in academia (KU & NDSU) for almost a decade as a faculty and researcher.
- Dr. Suman is a well-known international expert in Multiaxial Fatigue & Fracture. He has also done research in the structural application of artificial intelligence & pattern recognition technology. His artificial intelligence-based pattern recognition work has also been listed by Smithsonian. He has several conference proceedings, journal papers, and book chapter publications (Mechanical Fatigue of Metals, Springer publication). He is also the creator of the famous SK Critical Plane Method for Multiaxial Fatigue.
- He has given talks at several national and international conferences and has served on International Conference on Multiaxial Fatigue and Fracture and ASTM E08 committees. He also won the Best Research Presentation Award at NDSU.
- Currently, Dr. Suman has been leading research on AI-based Defect Detection Technology for rocket motor grains at the Fairfield, CA site of Collins, and here to present his work.



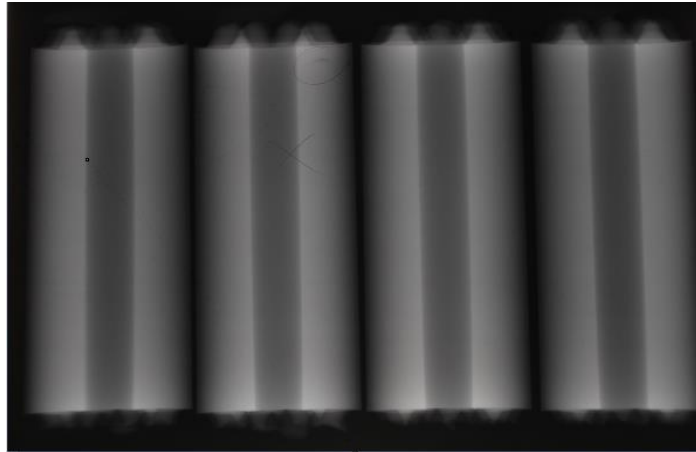
OVERVIEW & OBJECTIVE

- Develop AI based image processing algorithm for the detection of cracks, voids and foreign materials in energetic assemblies
- Develop concept model to demonstrate the basic functionality of technology
- To improve accuracy, efficiency, customization and scalability
- Automation with human like intelligence
- Enhance the productivity and minimization of production downtime
- Minimize variability and improve consistency in analysis and process

WHAT IS AI/MACHINE VISION



CURRENT PROCESS & LIMITATION



Inspector
???????

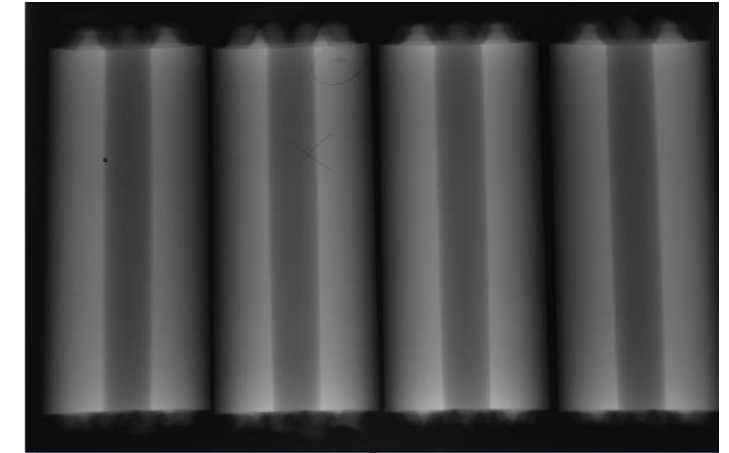
1. Hard to detect
2. Experience of examiner
3. Consistencies
4. No analytical correlation
5. Human Fatigue



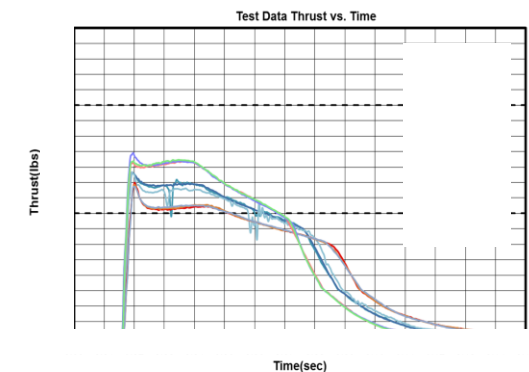
- Slow & Tedious Process
- Poor customer satisfactions
- Delivery delay
- Reduced Risk

PROPOSED SOLUTION

- Uses Hardware and Software in combination
- Use of historical data for training of AI-Neural Network
- Pattern recognition of defects
- Connect Defect and performance parameters
- Optimize Performance by proposing controlled process parameters



**AI-Defect Detection
(AIDD)**



VALUE PROPOSITION

Current State (Manual inspection)	Future state (AIDD System)
Induced human fatigue	Focused human decision making
Accuracy (Highly human dependent)	Optimized human involvement
Long cycle time	Focused value-added tasks
Reliability	AIDD assisted human decision (Improved)
Manual inspection	AIDD System
Operator based knowledge	Sustainable system knowledge
Constrained capacity	Flexible capacity (data driven management)

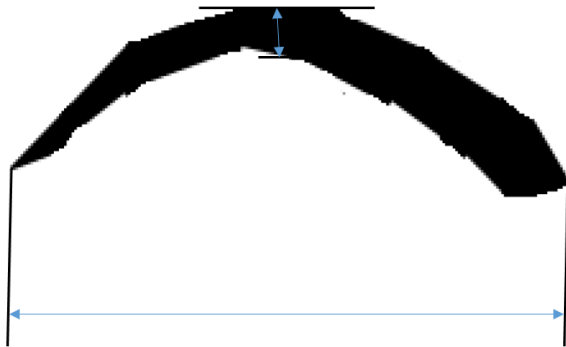
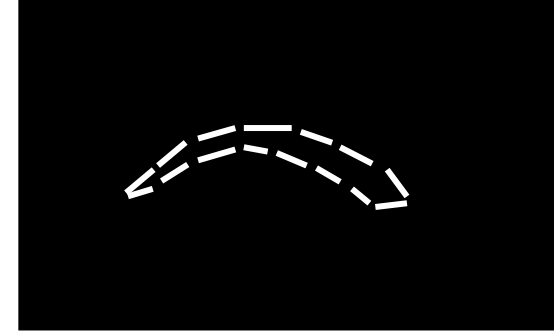
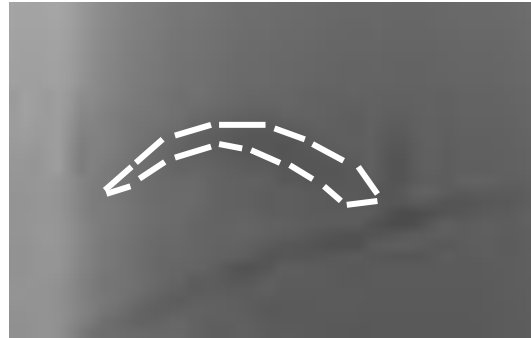
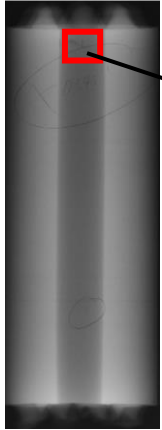
IMAGE ACQUISITION

- Digital image with known PPI & x-ray Parameters
 - camera
 - digital scanner
 - digital x-ray machine
- Known lighting parameter
- Clear information about background color
- Camera parameter if any



```
51 48 51 62 62 56 55 43 47 50 53 57 64 68 59 58 60 62 61 57
57 51 49 57 55 59 60 51 47 50 48 54 61 63 60 56 59 58 58 55
59 51 50 55 54 61 58 53 49 47 46 51 59 60 62 58 61 59 58 58 51
58 53 53 50 56 55 49 56 55 48 55 54 60 59 60 60 61 58 56 57 48
60 57 53 42 55 44 42 61 60 50 66 61 58 57 53 56 55 52 52 51 46
58 64 53 42 56 41 38 63 60 47 63 63 56 54 48 49 48 49 49 50 47
56 66 54 51 57 49 44 59 55 45 53 63 55 51 48 43 42 49 51 53 56
57 69 54 56 55 57 54 60 55 45 45 63 53 47 49 37 41 51 54 62 72
65 75 61 60 57 53 52 49 50 56 50 66 46 46 45 43 58 73 73 75 74
62 63 55 60 57 49 49 51 54 57 56 67 46 42 43 47 55 72 83 83 85
54 46 44 48 52 50 54 58 58 52 49 53 45 41 40 45 53 51 51 70 88
54 49 57 51 45 43 49 55 55 47 43 43 46 37 32 44 59 47 38 68 80
56 49 61 57 49 42 39 37 43 43 40 35 44 29 23 41 69 62 63 82 90
55 44 51 55 51 43 36 35 38 36 30 26 40 31 34 53 62 56 78 90 104
54 49 51 54 47 41 37 40 34 28 23 26 40 42 54 67 42 45 85 91 101
50 43 36 41 44 48 39 29 23 18 19 29 35 37 59 64 39 49 92 97 105
47 44 46 50 47 37 34 37 30 20 14 32 39 35 63 65 46 74 104 103 111
43 46 49 50 45 38 35 32 30 29 27 40 41 40 65 58 53 90 115 104 97
43 47 48 46 47 46 37 26 22 29 33 42 41 43 65 53 56 88 98 102 106
43 44 44 44 44 44 35 27 23 27 27 35 35 40 61 51 60 87 96 117 125
40 40 44 43 37 31 31 32 33 26 19 28 31 31 51 50 58 85 103 126 124
44 40 41 42 36 29 31 36 34 22 11 22 30 30 49 61 53 78 102 122 116
47 44 41 38 38 39 37 35 27 22 13 20 31 31 50 69 51 67 104 123 121
44 46 42 37 38 42 41 38 30 32 21 23 29 26 44 65 53 50 86 112 121
47 44 46 40 37 41 41 33 29 29 28 33 37 35 40 58 51 40 65 93 114
45 45 49 42 35 34 36 32 26 26 25 29 29 26 36 59 59 56 69 85 107
44 45 50 43 35 31 30 29 31 28 29 33 34 29 32 46 60 50 40 81 91
41 41 45 40 37 34 30 29 31 30 31 34 34 30 25 28 49 49 38 77 91
38 40 46 39 38 37 34 35 36 34 32 27 25 26 29 28 45 55 53 52 91
45 51 56 45 42 39 37 40 38 38 41 40 39 38 28 16 34 44 44 27 69
57 61 63 47 44 41 39 41 50 41 37 36 36 39 32 21 30 51 61 52 69
60 61 60 43 44 44 42 42 42 35 36 39 40 39 37 32 29 44 63 60 54
54 58 58 52 55 48 43 41 43 46 43 38 34 36 41 44 33 42 55 49 51
40 50 50 57 54 54 51 47 44 44 44 40 40 40 40 40 40 40 40 40 40
```

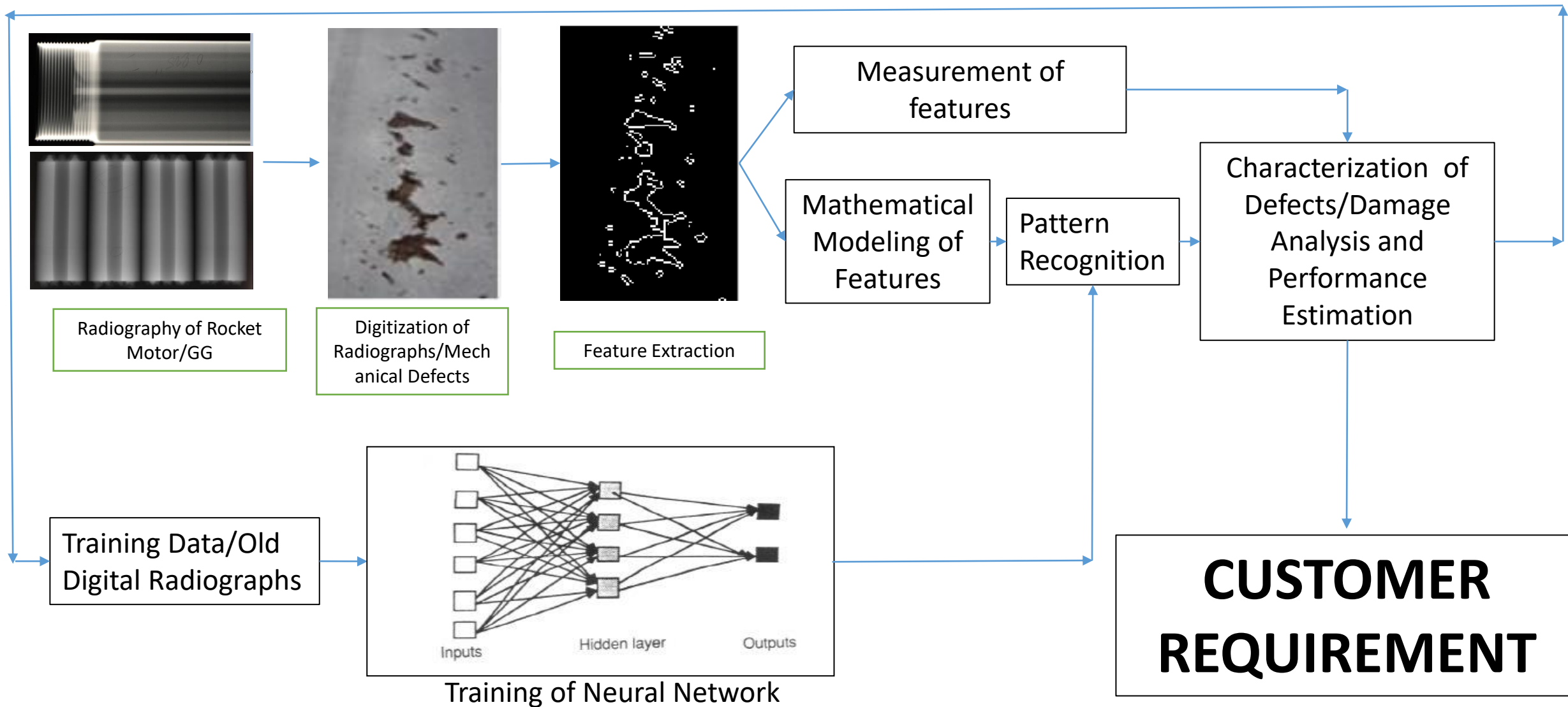

IMAGE PROCESSING



DEFECT PARAMETERS

- Length of crack
- Width of crack
- Some of the sharp angles of different locations
- Over all area of the defect

MACHINE VISION & AI



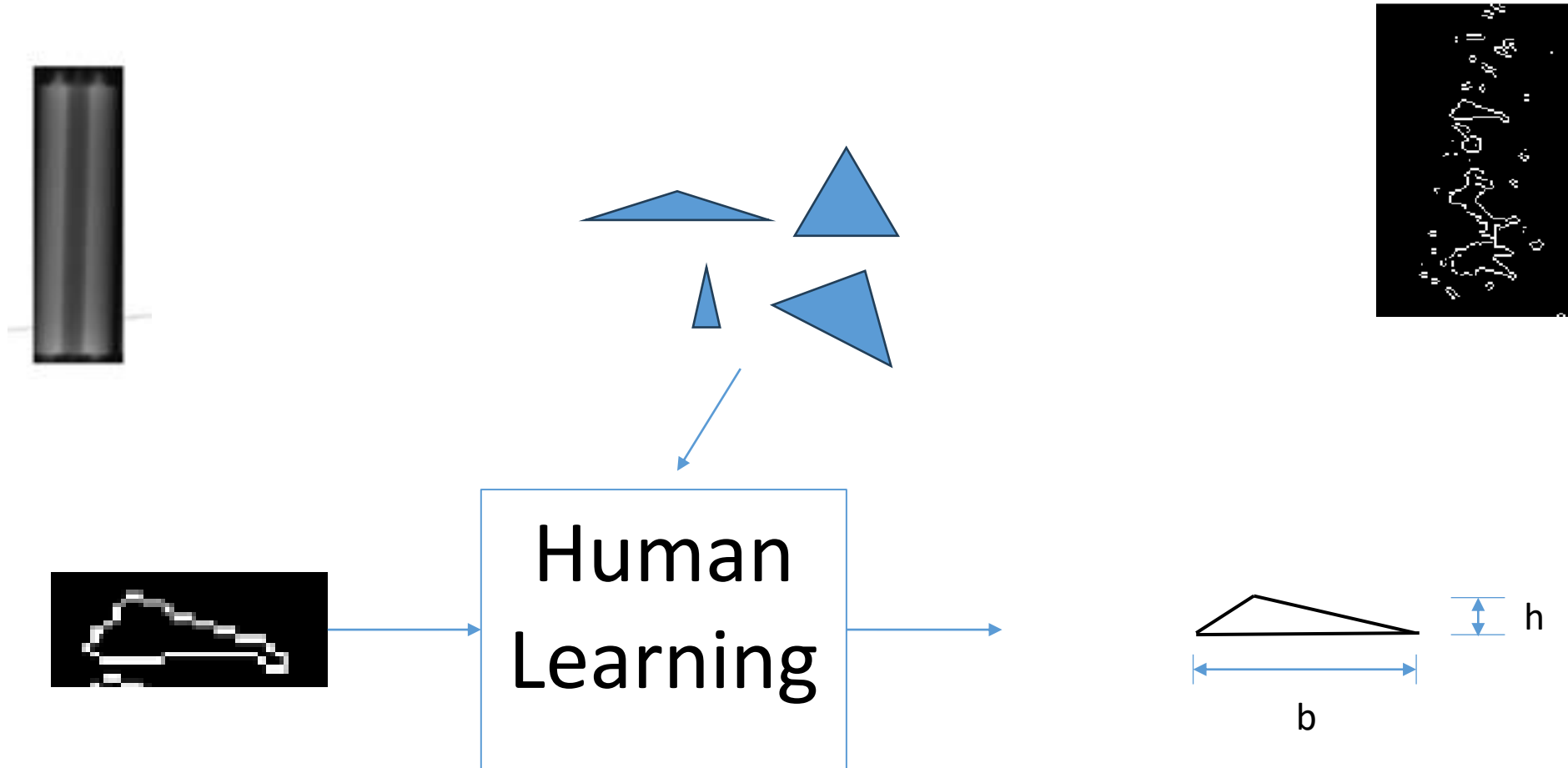
BUILDING OF AI NEURAL NETWORK

Artificial Defect Based Approach

- Defects are created manually to introduce in the image for training purpose
- Complement contrast (reverse contrast to make crack and defects more visible)
- Reconstruction based methods: Self trained encoders and decoders to reconstruct the images for anomaly detection

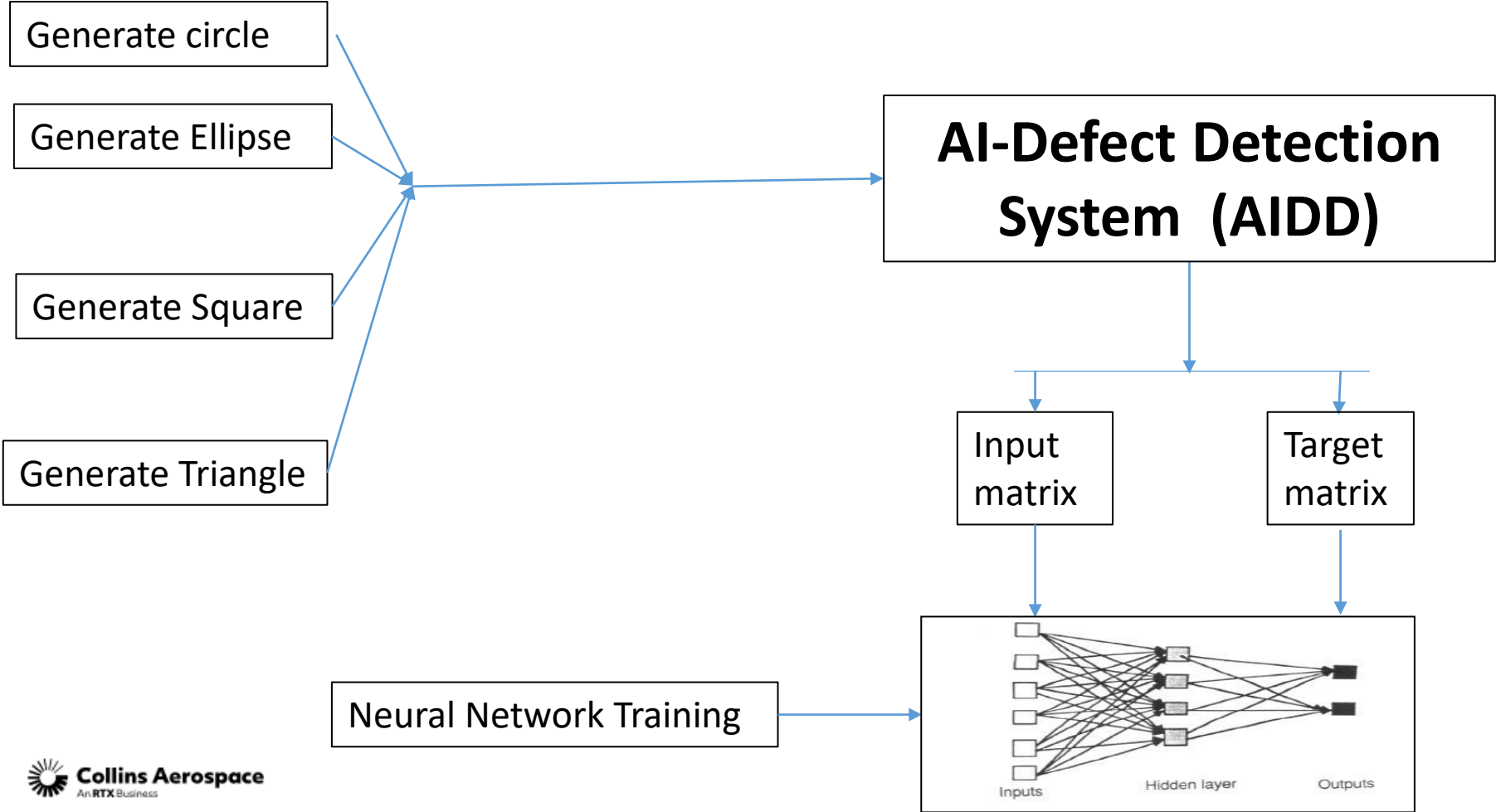
BUILDING OF AI NEURAL NETWORK

Geometrical Shape Based Approach

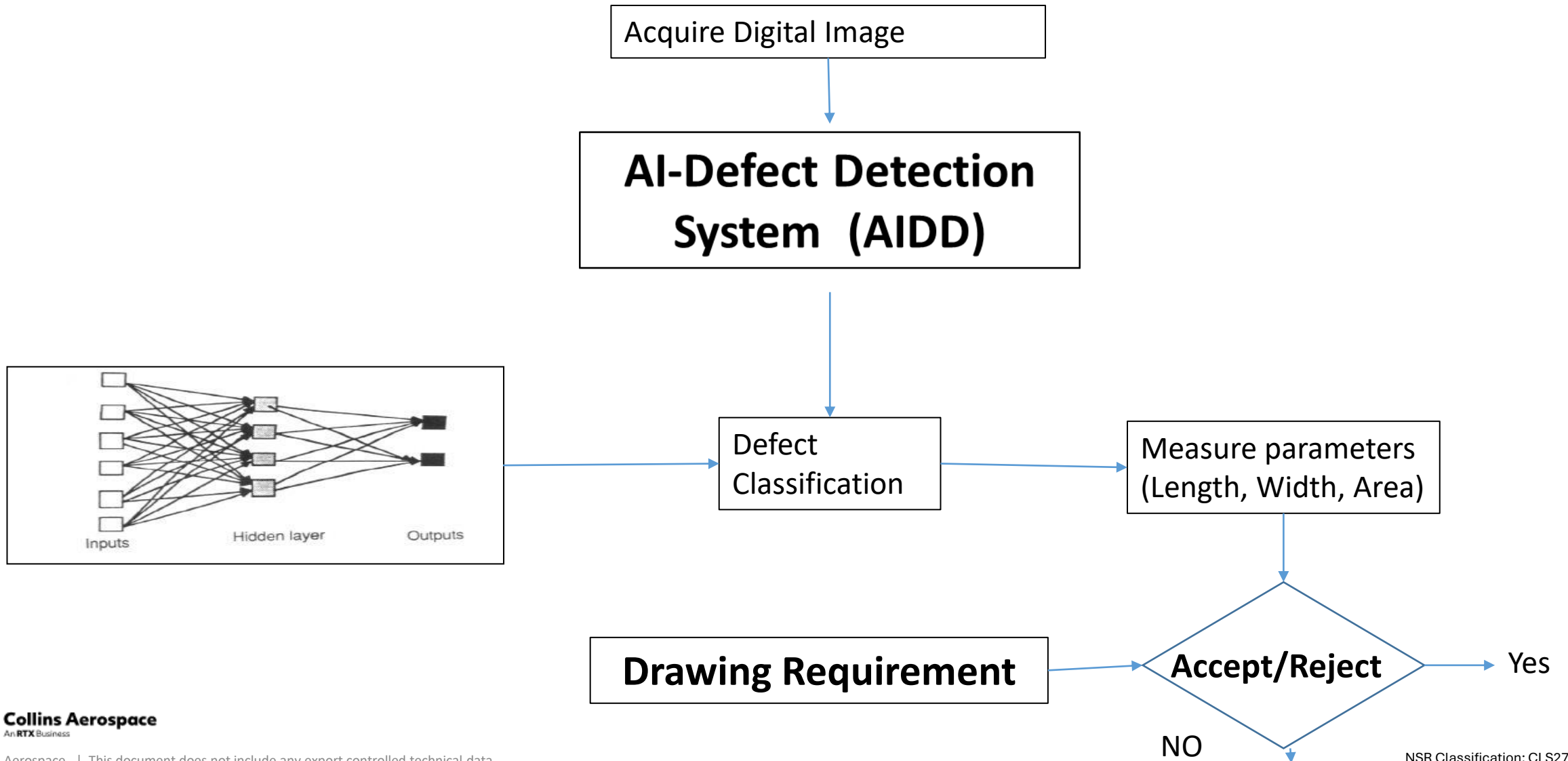


BUILDING OF AI NEURAL NETWORK

Geometrical Shape Based Approach

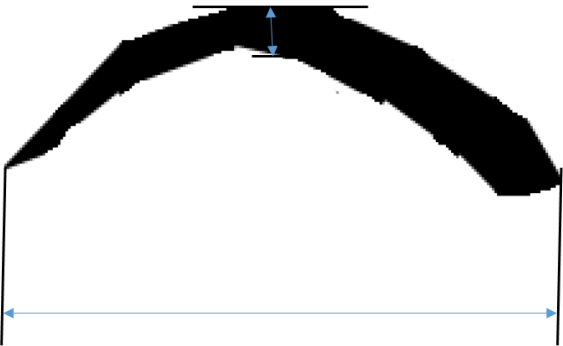


ANALYSIS PROCEDURE

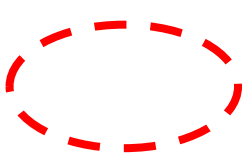
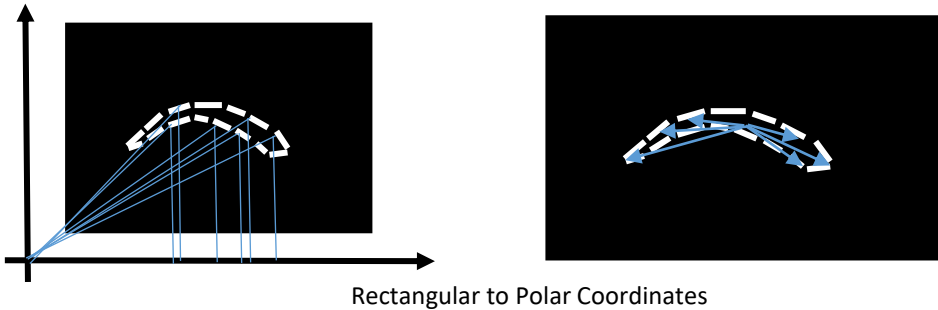


DEFECT ANALYSIS

Measurement of features

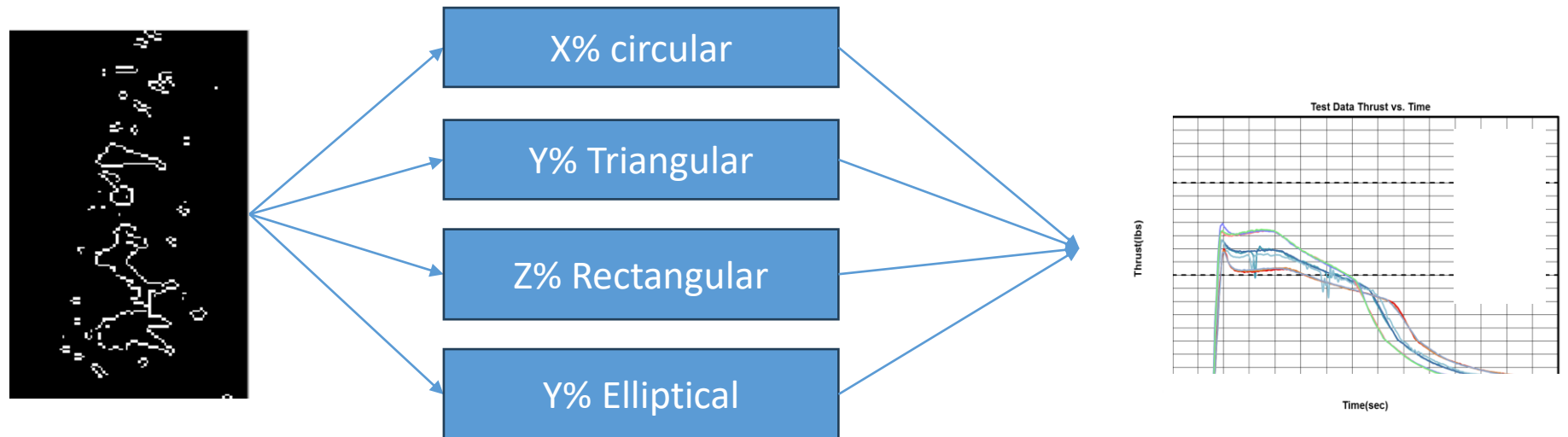


Mathematical Modeling of Features



PATTERN & PERFORMANCE

- Understand the shape of the defects
- Mathematically model the defect
- Analyze the defect for its burn pattern
- Predict the ballistic performance curve



PROOF OF CONCEPT

```
Network Already Exist');
```

```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```

```
for for pattern
```

```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```

```
perimeter points to
```

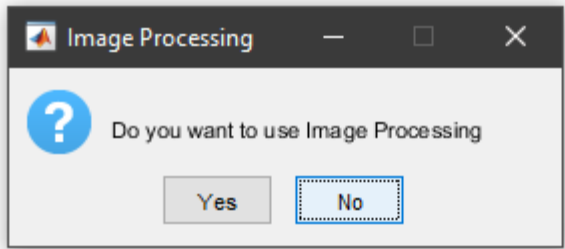
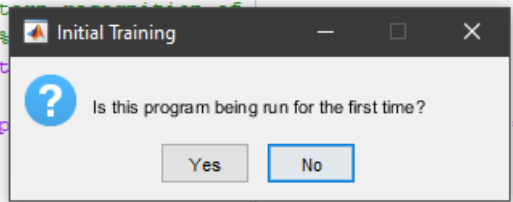
```
for sample=200,'p
```

```
=1000');
```

```
=100',
```

```
=200',
```

```
=1000',
```



Input image



```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```

```
meter for for pattern recognition of
```

```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```

```
perimeter points to be taken for pattern recognition', ...
```

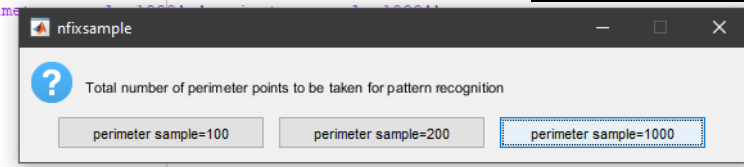
```
for sample=200,'perimeter sample=1000');
```

```
=100',
```

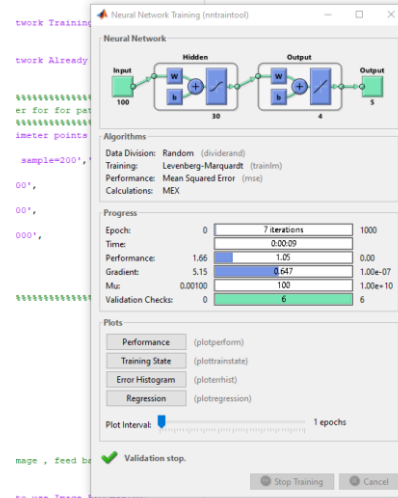
```
=200',
```

```
=1000',
```

```
%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%%
```



```
.....
```



SAMPLE OUTPUT

Neural Network Training (nntraintool)

Neural Network

Input: 100, Hidden: 30, Output: 4

Algorithms

Data Division: Random (dividerand)
Training: Levenberg-Marquardt (trainlm)
Performance: Mean Squared Error (mse)
Calculations: MEX

Progress

Epoch:	0	1 iterations
Time:		0:00:06
Performance:	1.03	1.03
Gradient:	5.33	5.33
Mu:	0.00100	1.00e+11
Validation Checks:	0	0

Plots

Performance (plotperform)
Training State (plottrainstate)
Error Histogram (ploterrhist)
Regression (plotregression)

Plot Interval: 1 epochs

✓ 'Maximum MU reached.'

Stop Training Cancel

Output Params

Length_of_Defect_in_INCH=4.326316e+00
Width_of_Defect_in_INCH=1.789474e-01
Area_of_Defect_in_INCH_SQUARE=3.870914e-01

OK

Defect Geometry is TRIANGULAR

OK

DECISION

REJECT according to drawing requirement

OK

COLLABORATION

- RTRC
- ATC
- Others??????

ACKNOWLEDGEMENT

- My Leadership
- Engineering Team at Fairfield
- Conference Committee

THANK YOU FOR
YOUR
ATTENTION AND ATTENDANCE

Questions?????