

AI-Driven Claims Analytics

Machine Learning Meets Insurance Claims



AI Driven Analytics

THE END OF THEORY: THE DATA DELUGE MAKES THE SCIENTIFIC METHOD OBSOLETE



Chris Anderson (canderson@wired.com) is the editor in chief of Wired.

FOCUS

March 2018

THE IMPACT OF ARTIFICIAL INTELLIGENCE ON THE (RE)INSURANCE SECTOR



HOW AI WILL IMPACT THE (RE)INSURANCE INDUSTRY

HOW ARTIFICIAL INTELLIGENCE WILL IMPACT THE (RE)INSURANCE INDUSTRY



DENIS KESSLER
Chairman & CEO, SCOR

Denis Kessler, a French citizen, is a graduate of HEC business school (Ecole des Hautes Etudes Commerciales), holds a PhD in economics and advanced degrees in economics and social sciences, and is a Fellow of the French Institute of Actuaries.

He was Chairman of the Fédération Française des Sociétés d'Assurance (FFSA), Senior Executive Vice-President and member of the Executive Committee of the AXA Group and Executive Vice-President of MEDEF (Mouvement des Entreprises de France). He joined SCOR as Chairman and Chief Executive Officer on 4 November 2002. In January 2016, he was elected to join the Academy of Moral and Political Sciences of the Institut de France.

ARTIFICIAL INTELLIGENCE: A BURGEONING
FIELD OF RESEARCH WHICH HAS TAKEN US
INTO A NEW MACHINE AGE

John Hancock 'reinventing' life insurance to get people healthier, living longer: CEO

- CEO Marianne Harrison says John Hancock is "reinventing" the traditional life insurance model by only offering data-driven, interactive policies.
- The idea is to track fitness and health data through wearable devices and smartphones and reward policyholders for the steps they take.
- The company offers incentives to encourage people to live healthier, longer lives.

Michelle Fox | @MFoxCNBC

Published 3:54 PM ET Wed, 19 Sept 2018



AIDA Team's Past Track Record

COMPUTERWORLD SINGAPORE

Standard Chartered partners A*STAR's I2R to leverage data to gain business insights Zafrah Salim | Jan. 25, 2016



NEC Analytics Joint Lab



BANKING & FINANCE

ALL NEWS • BREAKING TODAY'S PAPER OPINION SME LIFESTYLE INFOGRAPHICS BLOGS FOCUS • HUB BFINVEST

AIA taps on A*Star's data analytics to study insurance consumers' needs

by Lee Meilian leema@sp.com.sg @LeeMeilianIT

'Engaging industry' a key priority in boosting S'pore as an R&D hub: NRF

AIA Group to up stake in Indian life insurance JV with Tata

SMRT partners A*Star to develop solutions to improve transport reliability

MORE FROM THE BUSINESS TIMES

Expect currency wars in 2016, DBS chief warns

Temasek fund invests undisclosed sum in homegrown

Hot stocks: Keppel and Sembcorp Marine fall more

DBS mentioned as possible buyer in 3 potential sales

AIA Group on Tuesday said it has signed a multi-year joint collaboration agreement with A*Star's Institute for Infocomm Research (I2R), Singapore's largest information and communications tech research institute. **ST PHOTO**

top news

the Sunday Times, April 14, 2013

S'pore team tops in predicting flight timings

It beats 170 teams with solution that could help airlines save millions of dollars

Grace Cheng Senior Correspondent

Transfers often have to put lay with long flight delays and even cancellations. Flights can leave late but arrive early. It is a puzzle that has frustrated airlines and travellers alike.

American conglomerate General Electric decided to find a solution. It launched the IT Flight Quest, with a prize of US\$100,000 (S\$74,000) to anyone who could develop a solution that lets airlines better predict flight arrival times and reduce passenger delays.

(From left) Advisor Li Xiao Li and team members Mr. Connor, Dr. Cao, Dr. Phee and Dr. Yap. The fifth member, who is not in the picture, is Dr. Chia.

SCIENCE HOME

App tells you if place is hot spot or dead town

Dr. Kishoreddy showing a visualization with the business application, which users from mobile phones are able to participate with and have which will go on there. **ST PHOTO**

Software identifies crooked sellers faster

Built by Visa and A*Star, I2R

Fighting crime through data mining

Institute for Infocomm Research works with leading credit card company to detect fraud using advanced data analytics technology. **OO GIN LEE reports**

A Singapore research institute is helping a credit card company weed out fraudulent online merchants.

The three-year collaboration started in October last year between the Institute for Infocomm Research (I2R) and the local office of the credit card company. The company cannot be named because of a commercial confidentiality agreement.

Data analytics scientists at the institute studied data from millions of credit card purchases involving thousands of online merchants and devised a scientific methodology to distinguish bona fide online vendors from internet fraudsters.

The company already knew which merchants were crooks but did not tell the institute. The customers and their purchases were not identified.

Dr Shonal Kishoreddy (left), acting head of the Institute's Data Analytics Department, said the scientists named

I2R has announced its partnership with SingTel to set up a joint laboratory to develop advanced data analytics for innovative, personalised and relevant information/services to mobile users.

SingTel and I2R Joint Laboratory

DU EXCLUSIVE

Strategic Partnerships Working with Industry to Create Innovation

Researchers at I2R are able to take raw data and apply sophisticated algorithms to it. They are able to phone information within

plied only basic transactions and this also had to track the activities. Earlier this month, I2R team also came up top international teams in a detection competition at the Singapore Management University here. The I2R Detection in Mobile technology and it can capture data from mobile phones. It is a data in an on-graduate.

Few consumers realise treasure trove of data is. GPS track location accelerometers and gyrometers and my in the many for its in a fish. Data.

Industry speak for software over the next three months also had to track the activities. Earlier this month, I2R team also came up top international teams in a detection competition at the Singapore Management University here. The I2R Detection in Mobile technology and it can capture data from mobile phones. It is a data in an on-graduate.

Few consumers realise treasure trove of data is. GPS track location accelerometers and gyrometers and my in the many for its in a fish. Data.

Her team has done research that can even detect a user's gender, just by looking at such raw data.

the Sunday Times **asia report**

kaggle

InformationWeek
THE BUSINESS VALUE OF TECHNOLOGY

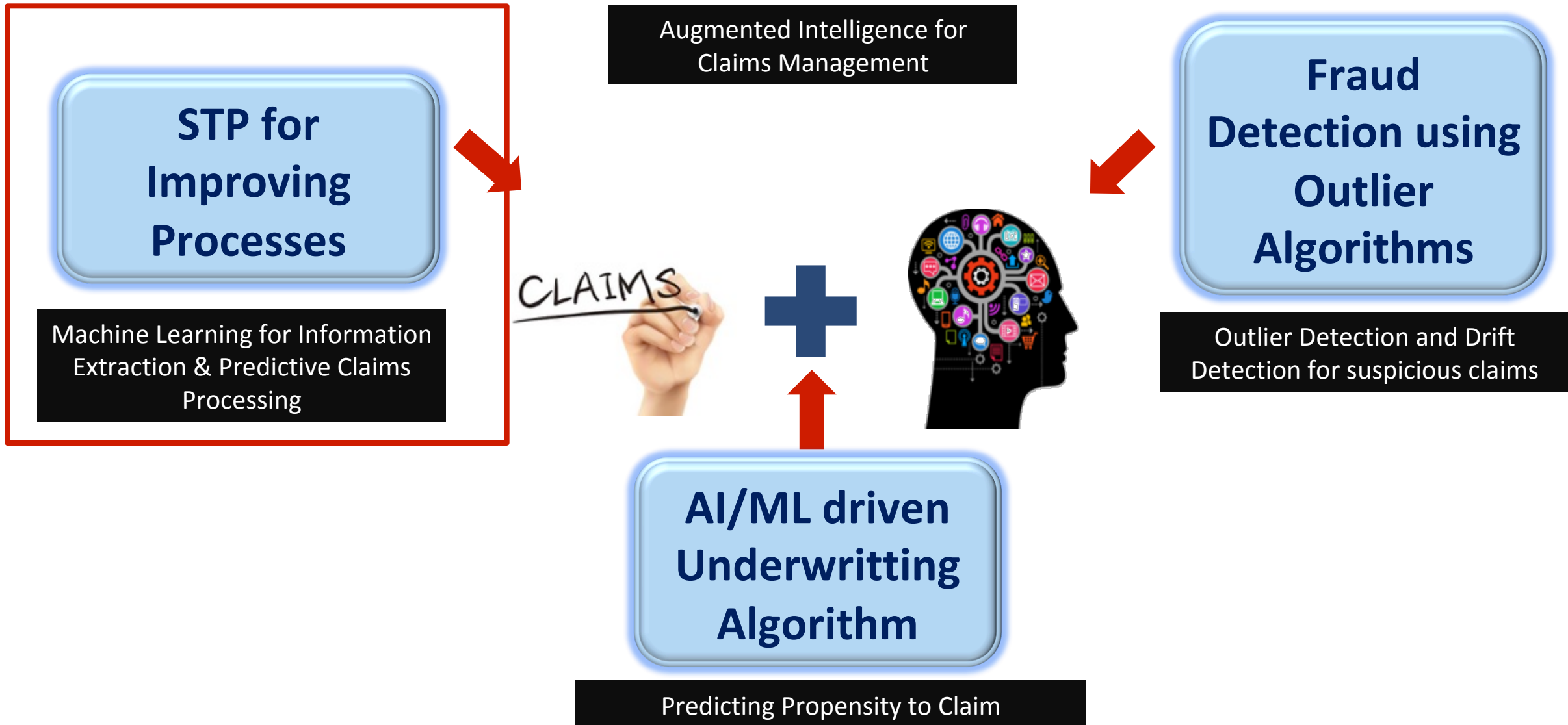
GIGAOM

GE Report

Forbes

MIT Technology Review

AIDA's AI *Driven SMART-CLAIMS* Portfolio



AIDA SMART-CLAIMS: Insurance Claims Straight Through Processing (STP)



AI Driven Analytics

AIDA SMART-CLAIMS System

AIDA Intelligent Info Extraction Engine

CLAIM RECORDS



Extracted Line Items and Link to Claim

Claim Records + Line Items

Client Info, Policy, Hospital, ICD Code, Bill Amount, Policy Exclusions, Claim Notes, Surgical Codes

AIDA Machine Learning Engine

Extended Claims Record with Payable Line Items

AIDA ICD Code Mining Engine

Claims Worksheet for Assessor Review

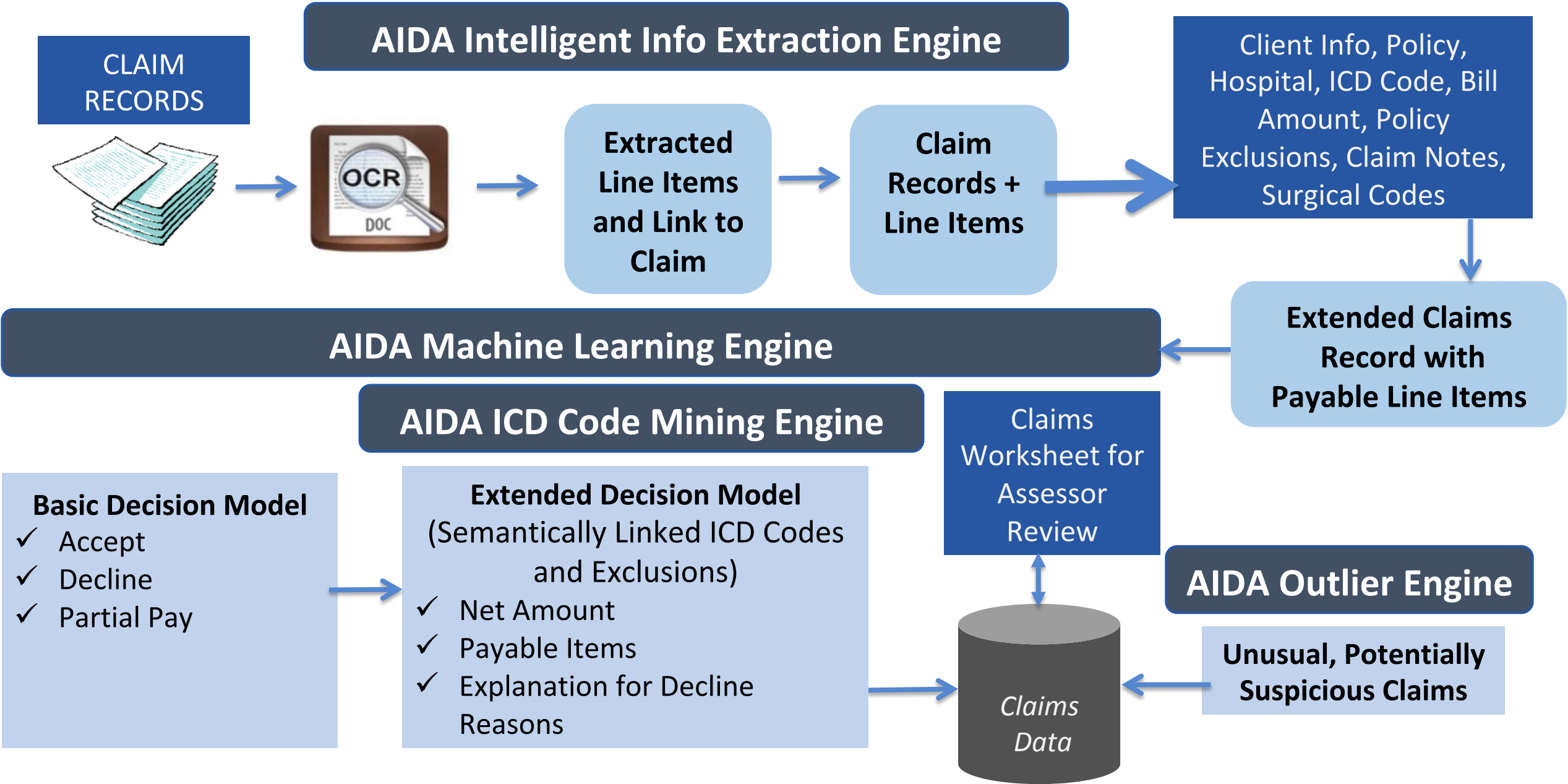
AIDA Outlier Engine

Basic Decision Model
✓ Accept
✓ Decline
✓ Partial Pay

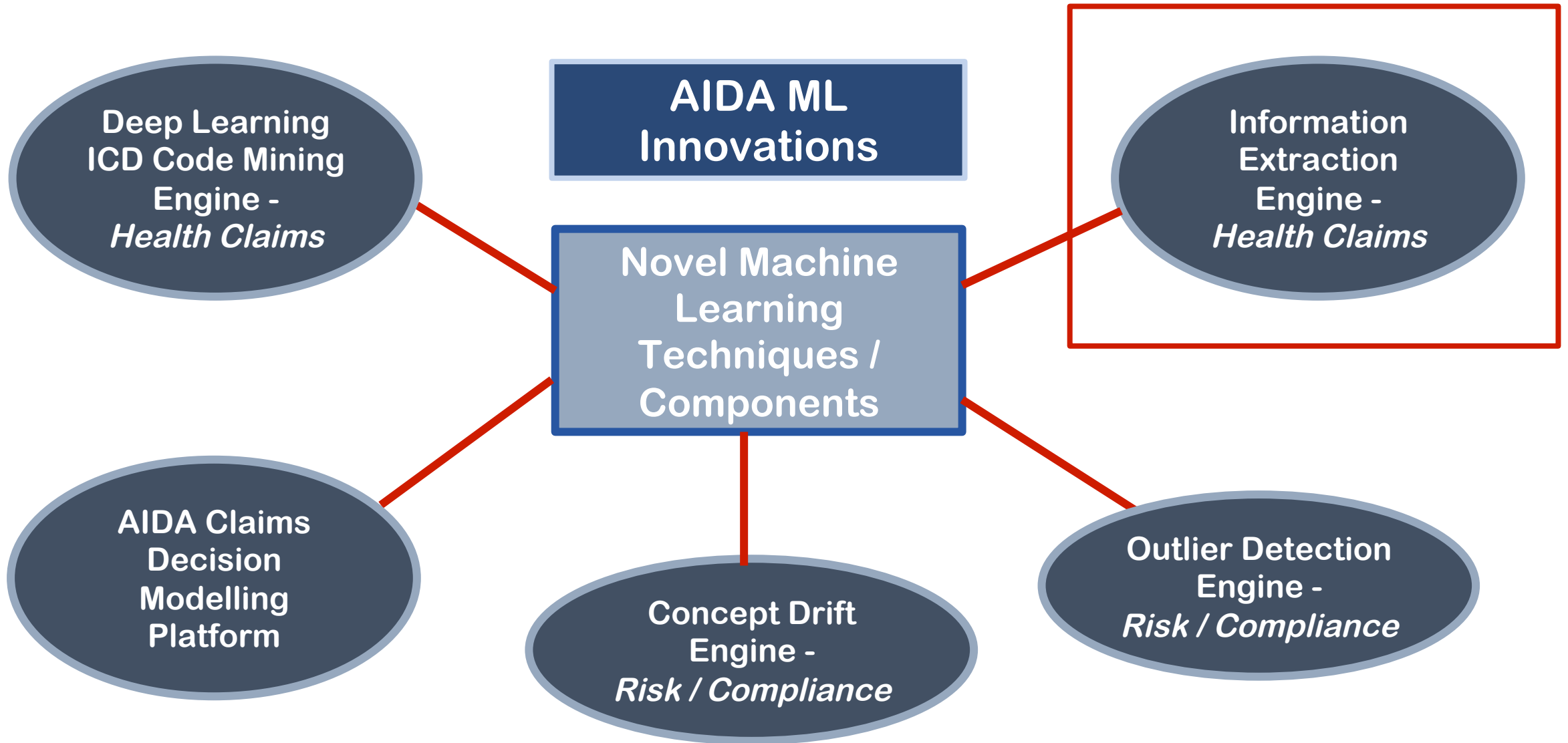
Extended Decision Model
(Semantically Linked ICD Codes and Exclusions)
✓ Net Amount
✓ Payable Items
✓ Explanation for Decline Reasons



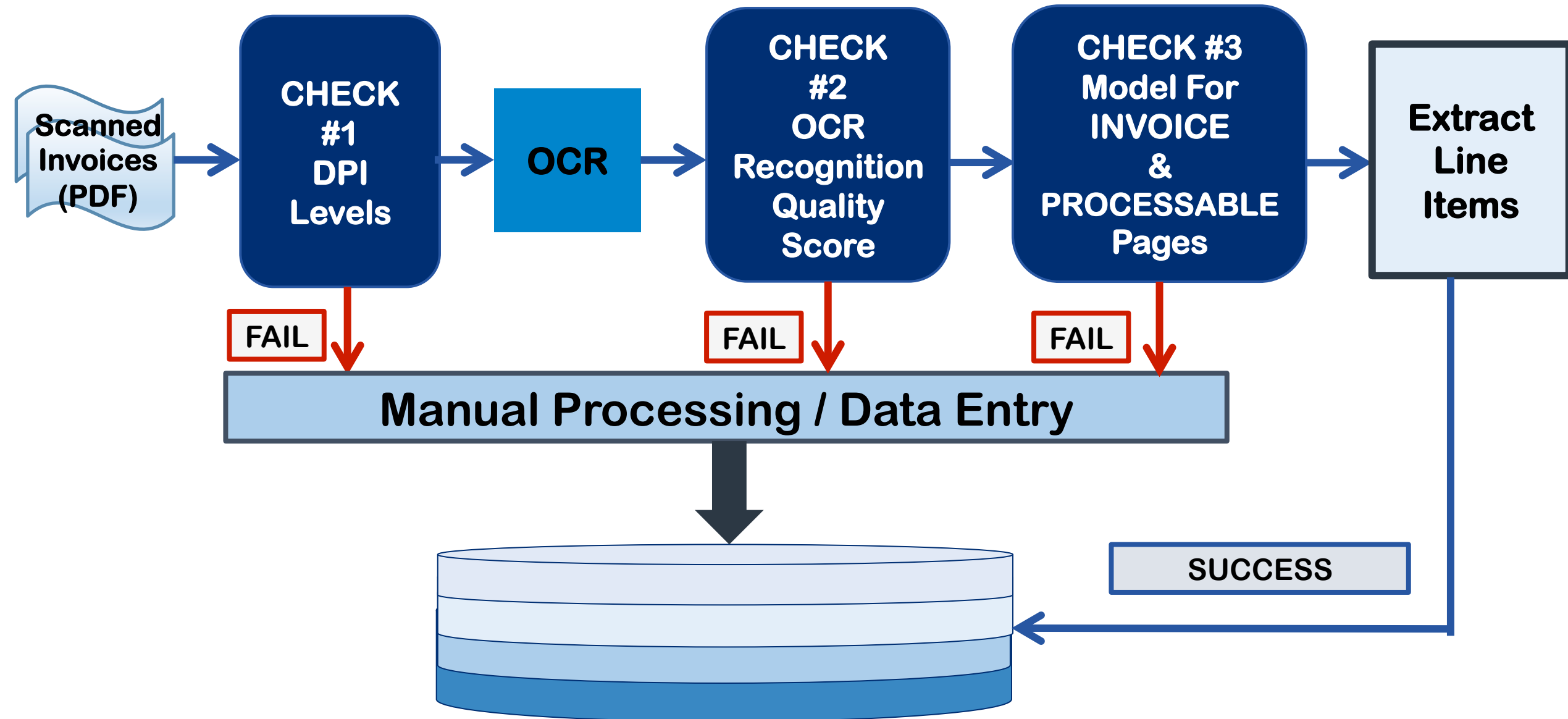
Unusual, Potentially Suspicious Claims



AIDA – Machine Learning Innovations



AIDA Intelligent Information Extraction



Invoice 119

| Tanggal | Kode | Keterangan | Jumlah | Nilai |
|----------------------|------------|---|--------|------------------|
| Accommodation | | | | |
| 03 Jan 2018 | 99007010 | Cuci Rambut/ Hair Wash & Blow Short | 1 | 70,000 |
| 03 Jan 2018 | 99007005 | Conditioner | 1 | 7,500 |
| | | SubTotal : | | 77,500 |
| Bed Charges | | | | |
| 02 Jan 2018 | 11001007 | Room Charge: VIP | 1 | 2,000,000 |
| | | SubTotal : | | 2,000,000 |
| Consumables | | | | |
| 02 Jan 2018 | 0202030007 | Ecoflac Mix (16401) - B Braun | 1 | 10,725 |
| 02 Jan 2018 | 0202020018 | Intrafix SafeSet NF (4063004) - B Braun | 1 | 50,050 |
| 02 Jan 2018 | 0204010020 | Vasofix Safety 22G (4268091503) - B Braun | 1 | 64,350 |
| 02 Jan 2018 | 0201020013 | Tegaderm I.V. 7x8.5 cm (1633) - 3M | 1 | 17,160 |
| 02 Jan 2018 | 0205010006 | Needle 18G x 1.1/2 inc (NN1838 R) Single Use - Terumo | 2 | 5,148 |
| 02 Jan 2018 | 0206010007 | Syringe 5 mL Luer Lock Tip (SS05L) - Terumo | 2 | 12,870 |
| 02 Jan 2018 | 0206010002 | Syringe With Needle 10 mL, 21G x 1.1/2 (SS10L2138) - Terumo | 1 | 10,439 |
| 02 Jan 2018 | 0202020018 | Intrafix SafeSet NF (4063004) - B Braun | 1 | 50,050 |
| 02 Jan 2018 | 0206010002 | Syringe With Needle 10 mL, 21G x 1.1/2 (SS10L2138) - Terumo | 1 | 10,439 |
| 02 Jan 2018 | 0206010002 | Syringe With Needle 10 mL, 21G x 1.1/2 (SS10L2138) - Terumo | 1 | 10,439 |
| 02 Jan 2018 | 0208050015 | Pastik Alkohol Swabs 2-Ply - Metz | 2 | 944 |
| 02 Jan 2018 | 0206010003 | Syringe 20 mL Luer Tip (SS20ES) - Terumo | 1 | 18,161 |
| 02 Jan 2018 | 0205010006 | Needle 18G x 1.1/2 inc (NN1838 R) Single Use - Terumo | 1 | 2,574 |
| 02 Jan 2018 | 0206010005 | Syringe 3 mL Luer Lock Tip (SS03L) - Terumo | 1 | 5,148 |
| 02 Jan 2018 | 0205010004 | Needle 23G x 1.1/4 inc (NN2332 R) Single Use - Terumo | 2 | 5,148 |
| 02 Jan 2018 | 0208050015 | Pastik Alkohol Swabs 2-Ply - Metz | 2 | 944 |
| 02 Jan 2018 | 0206010002 | Syringe With Needle 10 mL, 21G x 1.1/2 (SS10L2138) - Terumo | 4 | 41,756 |
| 02 Jan 2018 | 0208050015 | Pastik Alkohol Swabs 2-Ply - Metz | 2 | 944 |
| 02 Jan 2018 | 0206010005 | Syringe 3 mL Luer Lock Tip (SS03L) - Terumo | 1 | 5,148 |
| 02 Jan 2018 | 0205010004 | Needle 23G x 1.1/4 inc (NN2332 R) Single Use - Terumo | 1 | 2,574 |
| 02 Jan 2018 | 0206010002 | Syringe With Needle 10 mL, 21G x 1.1/2 (SS10L2138) - Terumo | 1 | 10,439 |
| 02 Jan 2018 | 0206010005 | Syringe 3 mL Luer Lock Tip (SS03L) - Terumo | 1 | 5,148 |
| 02 Jan 2018 | 0205010006 | Needle 18G x 1.1/2 inc (NN1838 R) Single Use - Terumo | 1 | 2,574 |
| 02 Jan 2018 | 0208020029 | Glove Nitril Blue Non Steril Free Powder S (TGNPF-S) - TG Medical | 4 | 4,576 |
| 02 Jan 2018 | 0201030002 | Micropore Tape 1 Inch x 10 Yrd Non Dis - 3M | 1 | 29,000 |
| 03 Jan 2018 | 0206010002 | Syringe With Needle 10 mL, 21G x 1.1/2 (SS10L2138) - Terumo | 1 | 10,439 |
| 03 Jan 2018 | 0206010005 | Syringe 3 mL Luer Lock Tip (SS03L) - Terumo | 1 | 5,148 |
| 03 Jan 2018 | 0205010004 | Needle 23G x 1.1/4 inc (NN2332 R) Single Use - Terumo | 1 | 2,574 |
| 03 Jan 2018 | 0208050015 | Pastik Alkohol Swabs 2-Ply - Metz | 3 | 1,416 |
| | | SubTotal : | | 307,447 |

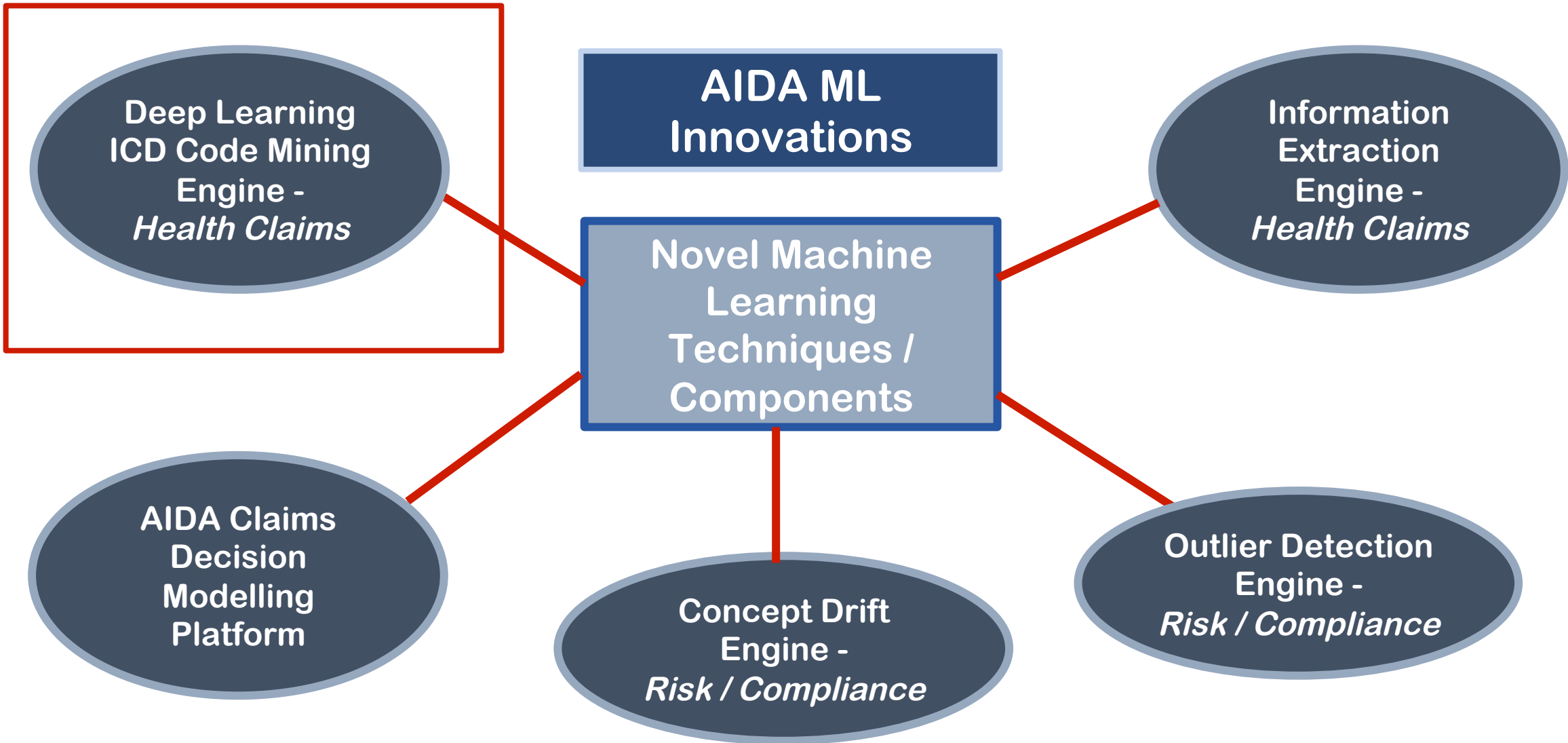
| Invoice ID | Page No | Description | Price | Quantity | Amount | Change Type |
|------------|---------|---|-------|----------|---------|-------------|
| - 119 | 1 | Cud Rambut/ Hair Wash & Blow Short | | | 70000 | Others |
| - 119 | 1 | Conditioner | | | 7500 | Others |
| - 119 | 1 | Room Charge: VIP | | 1 | 2000000 | Others |
| - 119 | 1 | Ecoflac Mix (16401) - B Braun | | 1 | 10725 | Others |
| - 119 | 1 | Intrafix SafeSet NF (4063004) - B Braun | | 1 | 50050 | Others |
| - 119 | 1 | Vasofix Safety 22G (4268091503) - B Braun | | 1 | 64350 | Others |
| - 119 | 1 | Tegaderm I.V. 7x8.5 cm / 1633 1 3M | | 1 | 17160 | Others |
| + 119 | | | | | | Others |

Discard Changes Save Changes

| | | | | | | | |
|---|-----|---|------------------------------------|--|---|-------|--------|
| - | 119 | 1 | Tegaderm I.V. 7x8.5 cm / 1633 1 3M | | 1 | 17160 | Others |
| + | 108 | 3 | | | | | Others |

Discard Changes Save Changes

AIDA – Machine Learning Innovations



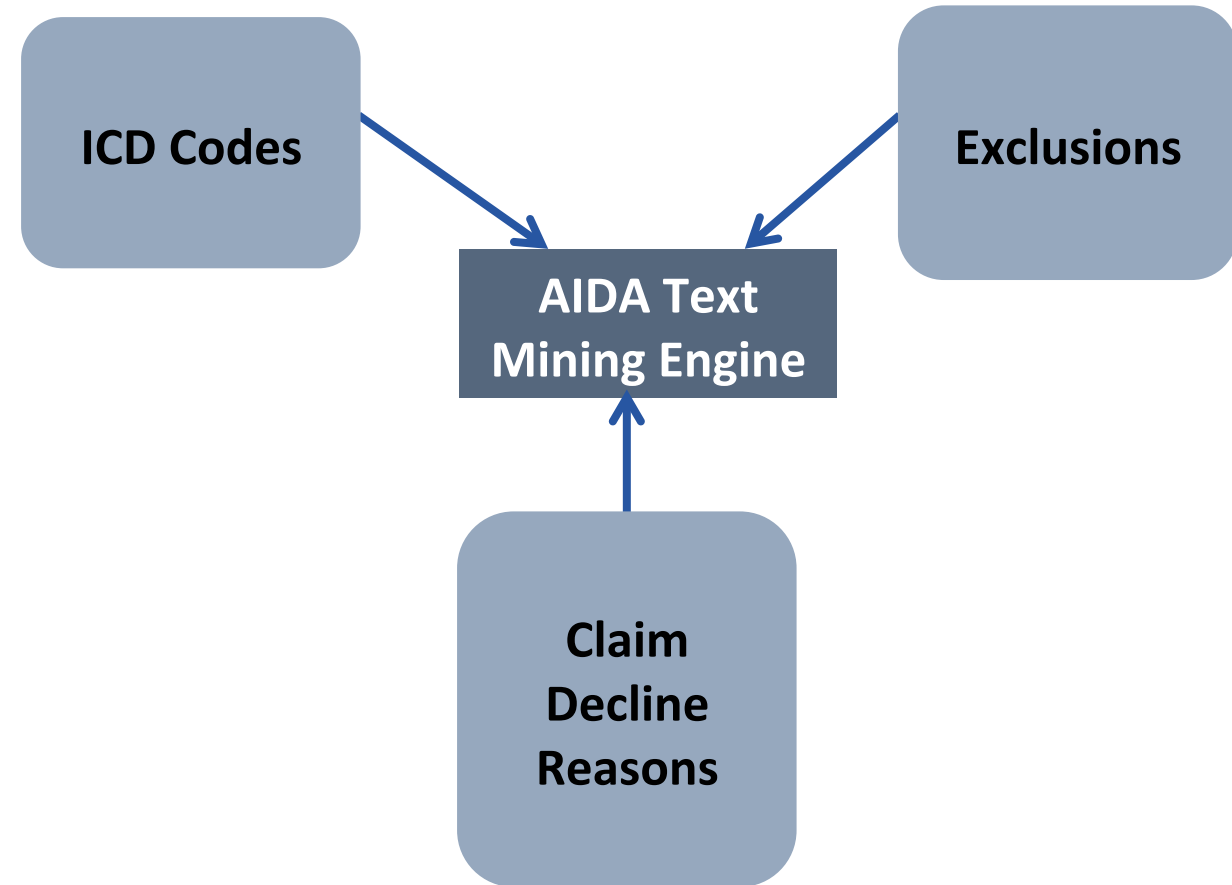
Deep Learning and Text Mining to Learn Contextual Connections

Key Challenge

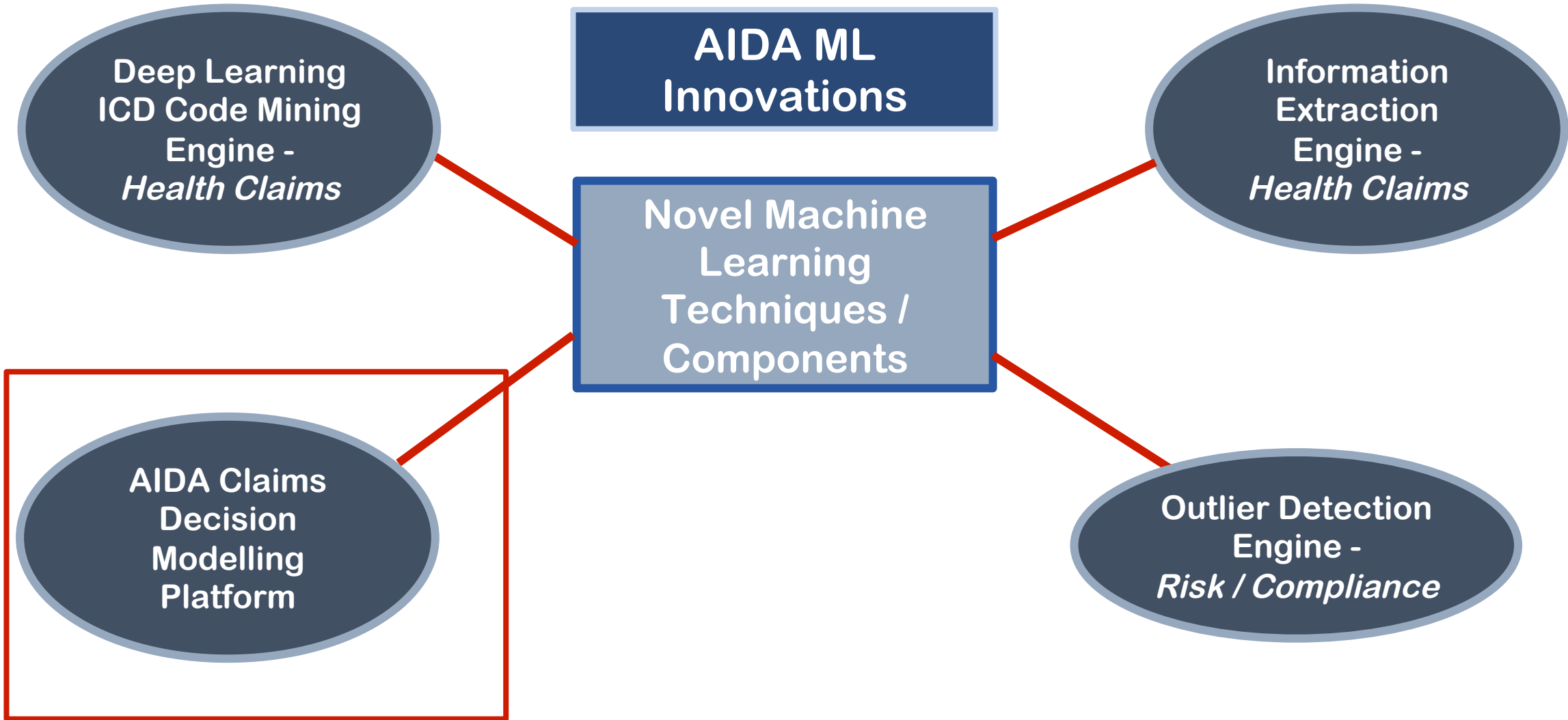
- ❑ ICD Codes and Exclusions are Not Semantically Linked
- ❑ ICD Codes are in Medical Terms (e.g. Obstetrics)
- ❑ Exclusions are in Layman's Terms (e.g. Maternity)

AIDA AI-CLAIMS Text Mining Engine Automatically Learns Contextual Connections from Text Data

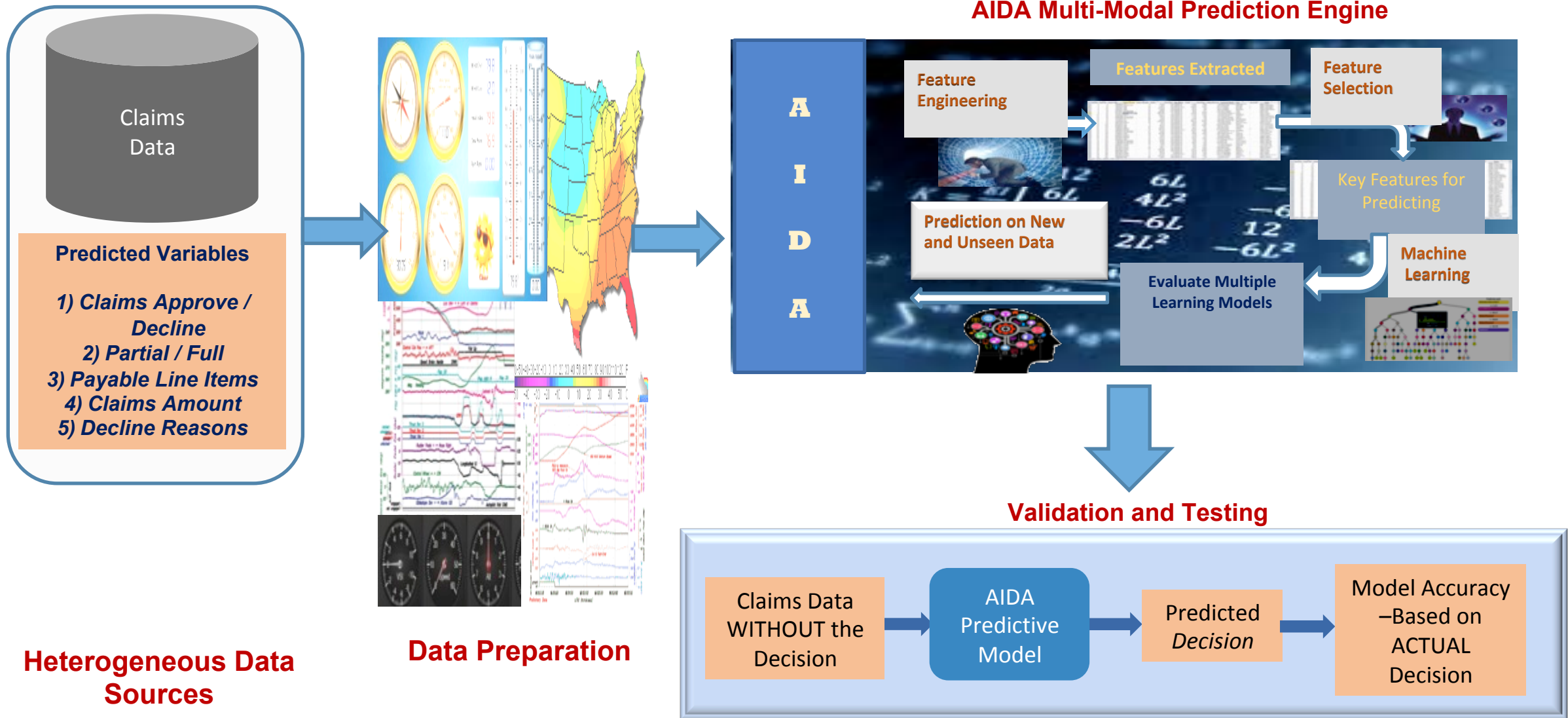
- Connect Terms to ICD Codes
- Connect Terms to Exclusions
- Connect ICD Codes to Related ICD Codes
- Connect Exclusion Codes to ICD Codes



AIDA – Machine Learning Innovations



AISA SMART-CLAIMS Claims Decision Engine



Model Results

Settings

Ground Truth Column:

Claim_Status

Positive:

APPROVED

Negative:

REJECTED

Machine Confidence: 0.2

0.0 1.0

0.2

Prediction Threshold: 0.5

0.0 1.0

0.5

Prediction Results:

- APPROVED
- REJECTED

Ground Truth:

- APPROVED
- REJECTED

Prediction Results

Download

(Total: 3960 rows SUM(Machine Confidence): 3801.7965)


| pp_seq_no | px_seq_no | rider | seq_no | Claim_ID | Claim_Status | predictions |
|-----------|-----------|-------|--------|----------|--------------|-------------|
| 1 | 0 | 2 | 43 | 3 | APPROVED | APPROVED |
| 1 | 1 | 1 | 16 | 1 | APPROVED | APPROVED |
| 6 | 0 | 2 | 112 | 4 | APPROVED | APPROVED |
| 2 | 0 | 2 | 57 | 1 | APPROVED | APPROVED |
| 6 | 0 | 2 | 64 | 2 | APPROVED | APPROVED |
| 2 | 0 | 2 | 57 | 3 | APPROVED | APPROVED |
| 1 | 0 | 2 | 38 | 2 | APPROVED | APPROVED |
| 1 | 0 | 2 | 36 | 2 | APPROVED | APPROVED |
| 1 | 0 | 2 | 41 | 1 | APPROVED | APPROVED |

STP Calculator

Straight Through Processing

STP Settings [Apply Settings](#)

Decision:
 APPROVED
 REJECTED

Machine Confidence '>':
0.0  1.0
0.8

Claim Amount '<':

STP Results






STP Rate: %

Accuracy: %

Cost \$:
Total amount of the false positive case

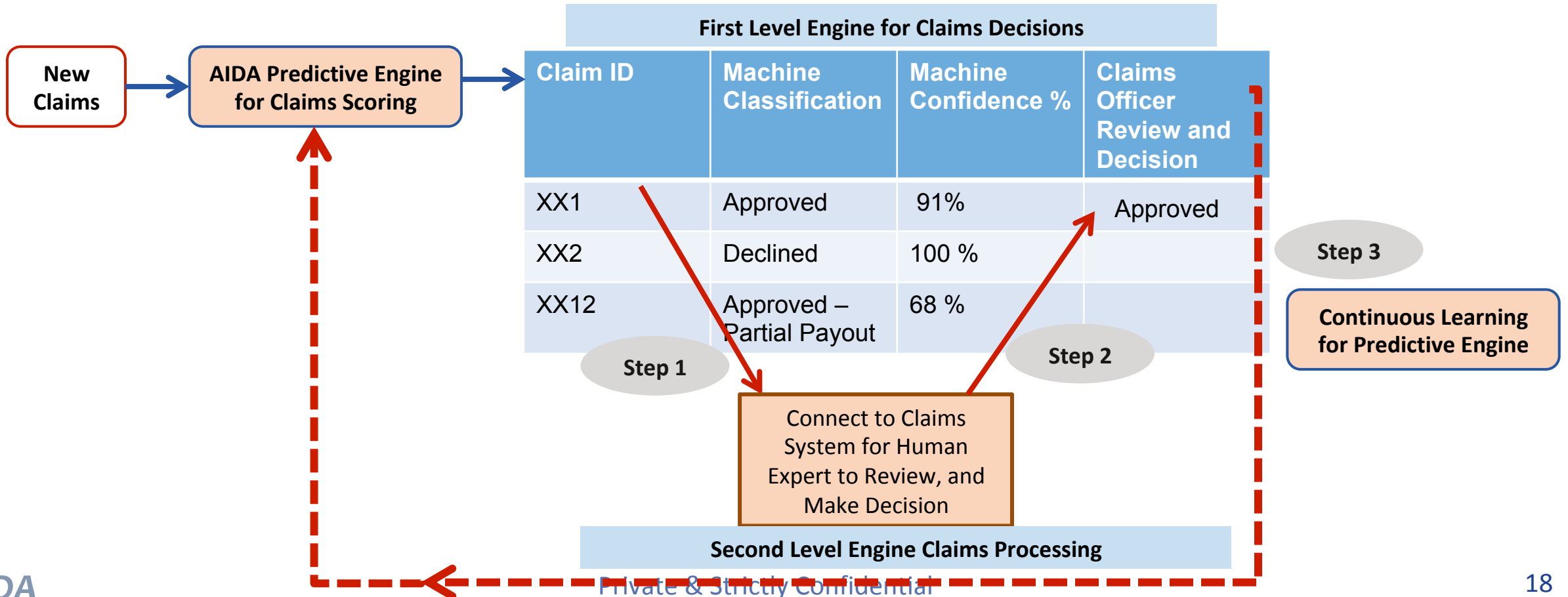
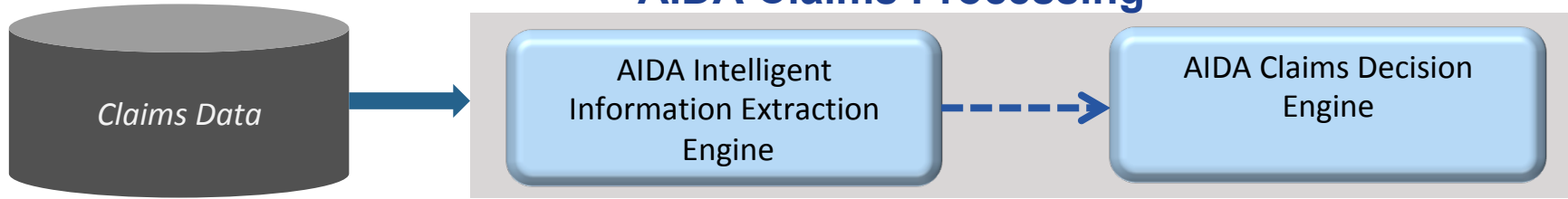
* Total number of claims: **3950**
* Number of claims after STP: **1215**
* Number of claims with correct prediction: **1196**

Prediction Results [Download](#)

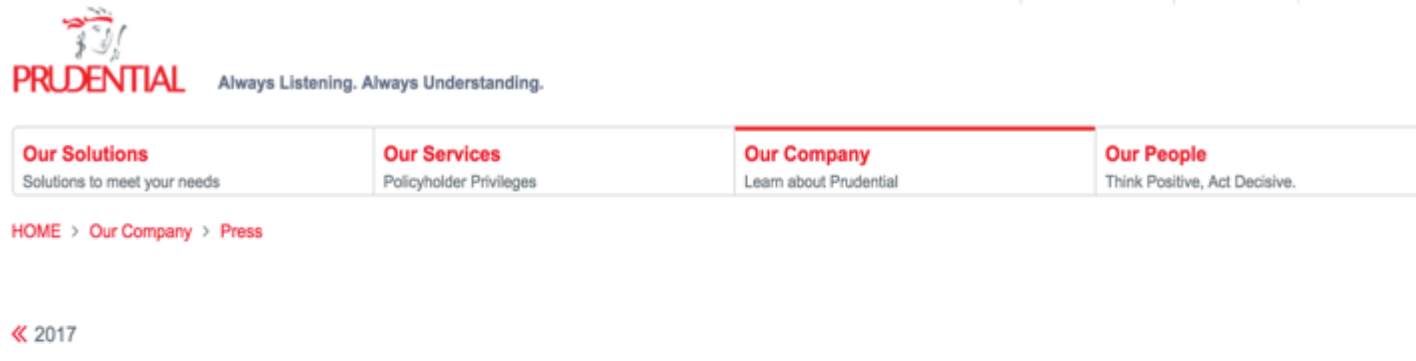
| pp_seq_no | px_seq_no | rider | Claim_ID | payment | Total_Bill_Amount | Ground_Truth | Prediction_Result | Approved_Probability | Rejected_Probability | |
|-----------|-----------|-------|----------|---------|-------------------|--------------|-------------------|----------------------|----------------------|---|
| 1 | 1 | 1 | 1 | 49.38 | 49.38 | APPROVED | APPROVED | 0.99931 | 0.00069 |  |
| 1 | 0 | 2 | 3 | 222.03 | 222.03 | APPROVED | APPROVED | 0.99928 | 0.00072 |  |
| 2 | 1 | 1 | 2 | 21.83 | 21.83 | APPROVED | APPROVED | 0.99923 | 0.00077 |  |
| 2 | 1 | 1 | 18 | 17.34 | 17.34 | APPROVED | APPROVED | 0.99917 | 0.00083 |  |
| 2 | 1 | 1 | 19 | 233.42 | 233.42 | APPROVED | APPROVED | 0.99916 | 0.00084 |  |

AIDA SMART-CLAIMS (Continuous Learning & Update)

AIDA Claims Processing



Prudential/AIDA @ Singapore Fintech Festival 2017



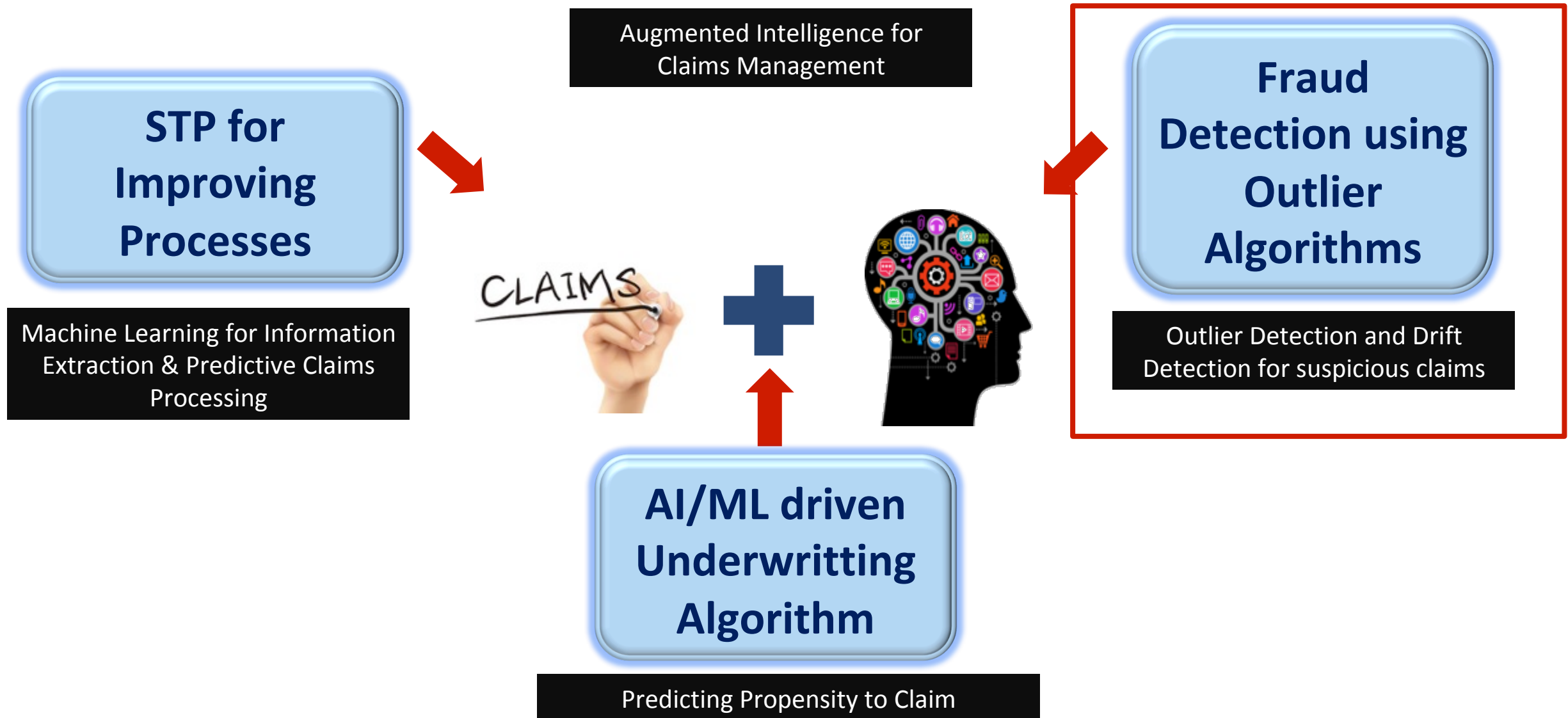
Insurance claims assessment in seconds soon a reality for Prudential Singapore PRUshield policyholders

Insurer trialing an intelligent machine learning-based solution that simplifies claims assessment

SINGAPORE, 13 November 2017 – Prudential Singapore (Prudential) is leading a step change in the way insurance claims are made with its trial of an industry-first, machine learning-based solution that assesses claims in seconds.

“ we passed some data to the AIDA team to analyse, ... we didn't tell them anything about the data but they made sense out of it. It made us realise we are sitting on a goldmine of data ..., ”

AIDA's AI *Driven SMART-CLAIMS* Portfolio



Outlier Analysis for Health Claims

Key Risk Indicators:

- ✓ Average and Total Number of Claims (Gender / Age / Race)
- ✓ Average and Total Claim Amount
- ✓ Number of Surgeries
- ✓ Average and Total Surgical Fee
- ✓ Unusual Surgeries (specific to ICD Code / Diagnosis)
- ✓ Re-Admission Patterns
- ✓ Length of Stay
- ✓ Number of Scans / Procedures
- ✓ Average and Total Procedure Fee
- ✓ Early Claims (with respect to policy inception date)
- ✓ Unusual Early Claims (specific to ICD Code / Diagnosis)
- ✓ Unusual Procedures (specific to ICD Code / Diagnosis)

Customisable and Configurable

AIDA Outlier Detection and Claims Risk Scoring

Outlier CLIENTS / DOCTORS / HOSPITALS for Functional Monitoring Components

AIDA Outlier Integration and Ranking Engine

Outlier for Each Feature

Outlier Clients / Doctors / Hospitals for Fj-Feature 1

Outlier Clients / Doctors / Hospitals for Fj-Feature 2

Outlier Clients / Doctors / Hospitals for Fj-Feature 3

Outlier Clients / Doctors / Hospitals for Fj-Feature 4

Outlier Clients / Doctors / Hospitals for Fj-Feature 5

Outlier Clients / Doctors / Hospitals for Fj-Feature k

AIDA Outlier Engine
(Five Outlier Algorithms : O1 – O5)

Customized Features per Function

Fj - Feature 1

Fj - Feature 2

Fj - Feature 3

Fj - Feature 4

Fj - Feature 5

Fj - Feature 6

Specific Features for EACH Functional Monitoring Component

Monitoring Functions

Number of Claims (Gender / Age Split)

Total Claim Amount (Gender / Age Split)

Average Claim Amount

Re-Admissions (Same Code)

Re-Admissions (Different Code)

Total Length of Stay

Average Length of Stay

Number of Early Claims

CLIENTS OUTLIERS

Top 10 ICD Codes Based on Claim Amount

All : All Top 10 ICD Codes

Grouping By: By ICD-Code

Outlier Feature

- All ICD Codes
- Top 10 ICD Codes Based on No. Of Claims
- Top 10 ICD Codes Based on Claim Amount
- Top 10 ICD Codes Based on Avg Claim Amount

Segmentation

- All Segments
- By Gender-Age Band
- By ICD-Code
- By Gender-Age-ICD

ICD Code

- All
- K29.7
- A09.9
- H26.9
- A90.X
- C50.9
- R50.9
- J40.X
- R50.8
- J18.9
- E14.9

| Clients- | NUMBER OF CLAIMS | TOTAL CLAIM AMOUNT | AVERAGE CLAIM AMOUNT | TOTAL LENGTH OF STAY | AVERAGE LENGTH OF STAY | NUMBER OF EARLY CLAIMS | NUMBER OF FREQUENT RE-ADMISSION SAME CODE | NUMBER OF FREQUENT RE-ADMISSIONS DIFFERENT CODE |
|----------|------------------|--------------------|----------------------|----------------------|------------------------|------------------------|---|---|
| 1368435 | 1.00 | 1.00 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 0.28 |
| 1480658 | 0.63 | 0.19 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 0.97 |
| 1495638 | 1.00 | 0.11 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 0.42 |
| 1229317 | 0.62 | 0.51 | 0.00 | 0.00 | 0.00 | 0.10 | 0.90 | 0.36 |
| 511 | 0.53 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.92 | 1.00 |
| 849146 | 0.63 | 0.17 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 0.57 |
| 933756 | 1.00 | 0.04 | 0.00 | 0.02 | 0.00 | 0.00 | 0.60 | 0.70 |
| 1175713 | 1.00 | 0.05 | 0.00 | 0.00 | 0.00 | 0.00 | 0.95 | 0.29 |
| 796476 | 0.24 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 1.00 |
| 997188 | 0.21 | 0.00 | 0.00 | 1.00 | 1.00 | 0.00 | 0.00 | 0.00 |



ID : 1000485

Age : 41

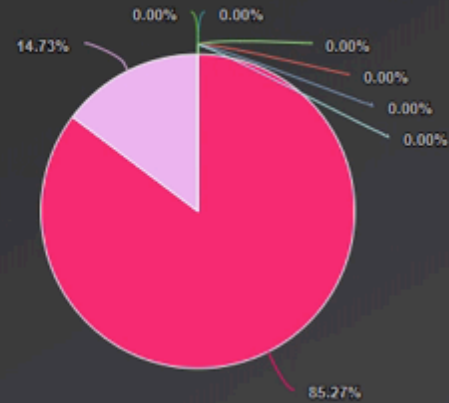
Occupation : BUSINESSWOMAN

Number of Policies : 6

RISK FUNCTIONS

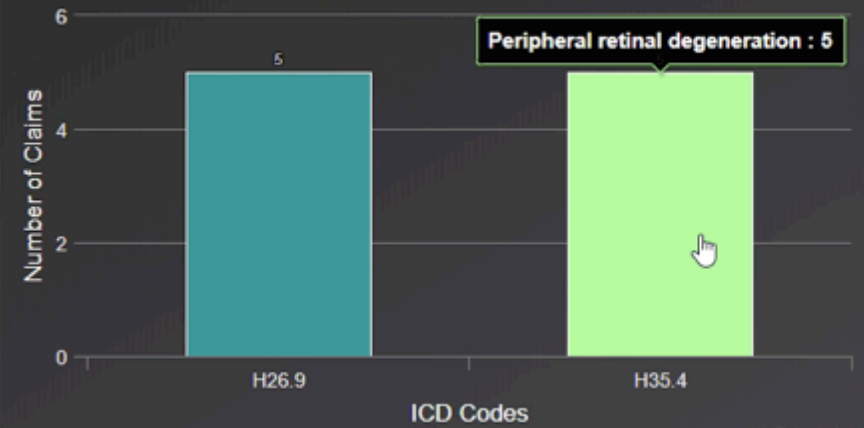
- No. of Claims : 5
- Total Claim Amount : 22K
- Average Claim Amount : 4.4K
- Total Length of Stay : 6.0
- Average Length of Stay : 3.0
- No. of Early Claims : 4
- No. of Frequent Re-admission Same Code : 4

Distribution across Risk Functions



Aida Technologies

Distribution across ICD Codes



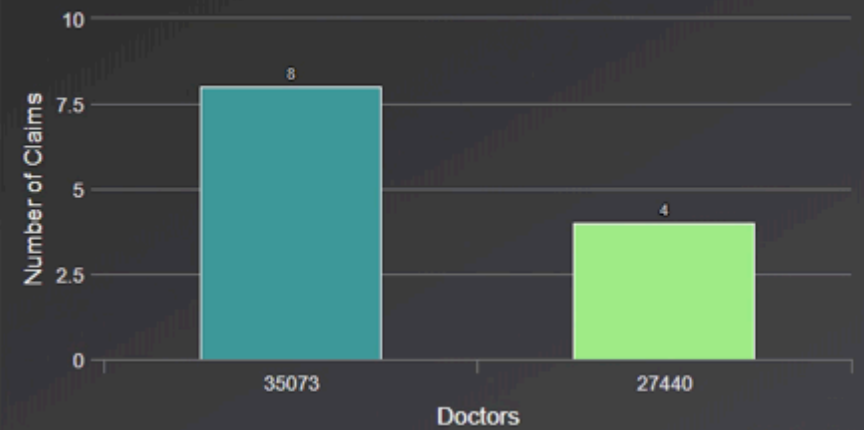
Aida Technologies

Distribution across Hospitals

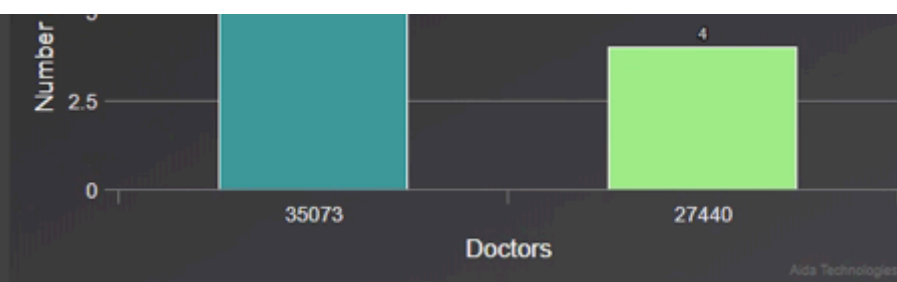
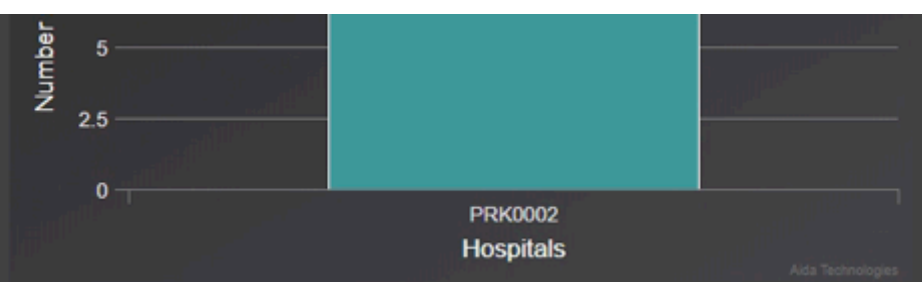


Aida Technologies

Distribution across Doctors



Aida Technologies



Hide Claim History

| Claim ID | Claim Date | Claim Amount | ICD Code | Hospital Code | Doctor Code | Policy Inception Date | Admission Date | Discharge Date | No. of days since Inception | Length of Stay |
|----------|------------|--------------|----------|---------------|-------------|-----------------------|----------------|----------------|-----------------------------|----------------|
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 27440 | 2013-10-01 | 2016-04-13 | 2016-04-15 | 925 | 2 |
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 35073 | 2013-10-01 | 2016-04-13 | 2016-04-15 | 925 | 2 |
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 27440 | 2014-02-01 | 2016-04-13 | 2016-04-15 | 802 | 2 |
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 35073 | 2014-02-01 | 2016-04-13 | 2016-04-15 | 802 | 2 |
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 27440 | 2014-04-01 | 2016-04-13 | 2016-04-15 | 743 | 2 |
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 35073 | 2014-04-01 | 2016-04-13 | 2016-04-15 | 743 | 2 |
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 27440 | 2014-06-01 | 2016-04-13 | 2016-04-15 | 682 | 2 |
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 35073 | 2014-06-01 | 2016-04-13 | 2016-04-15 | 682 | 2 |
| 16142097 | 2016-04-11 | 20475.95 | H26.9 | PRK0002 | 27440 | 2015-02-01 | 2016-04-13 | 2016-04-15 | 437 | 2 |

ID : 1000485
 Age : 41
 Occupation : BUSINESSWOMAN
 Number of Policies : 6

- RISK FUNCTIONS
- No. of Claims : 5
 - Total Claim Amount : 22K
 - Average Claim Amount : 4.4K
 - Total Length of Stay : 6.0
 - Average Length of Stay : 3.0
 - No. of Early Claims : 4
 - No. of Frequent Re-admission Same Code : 4

CLIENTS OUTLIERS

Outlier Feature

- All ICD Codes
- Top 10 ICD Codes Based on No. Of Claims
- Top 10 ICD Codes Based on Claim Amount
- Top 10 ICD Codes Based on Avg Claim Amount

All ICD Codes

Grouping By: All Segments



ID : 1368435

Age : 4
Occupation : CHILD
Number of Policies : 1

RISK FUNCTIONS

- No. of Claims : 59
- Total Claim Amount : 120K
- Average Claim Amount : 2K
- Total Length of Stay : 116.0
- Average Length of Stay : 2.0714285...
- No. of Early Claims : 0
- No. of Frequent Re-admission Sam...



ID : 1480658

Age : 33
Occupation : DRIVER
Number of Policies : 2

RISK FUNCTIONS

- No. of Claims : 29
- Total Claim Amount : 285K
- Average Claim Amount : 9.8K
- Total Length of Stay : 134.0
- Average Length of Stay : 5.8260869...
- No. of Early Claims : 0
- No. of Frequent Re-admission Sam...

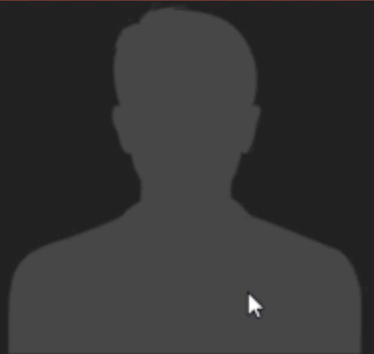


ID : 1495638

Age : 26
Occupation : COURIER
Number of Policies : 1

RISK FUNCTIONS

- No. of Claims : 60
- Total Claim Amount : 122K
- Average Claim Amount : 2K
- Total Length of Stay : 22.0
- Average Length of Stay : 2.75
- No. of Early Claims : 0
- No. of Frequent Re-admission Sam...



ID : 1229317

Age : 47
Occupation : EXECUTIVE
Number of Policies : 7

RISK FUNCTIONS

- No. of Claims : 38
- Total Claim Amount : 554K
- Average Claim Amount : 14K
- Total Length of Stay : 156.0
- Average Length of Stay : 4.875
- No. of Early Claims : 1
- No. of Frequent Re-admission Sam...



ID : 511

Age : 48
Occupation : BUSINESSMAN
Number of Policies : 4

RISK FUNCTIONS

- No. of Claims : 24
- Total Claim Amount : 89K
- Average Claim Amount : 3.7K
- Total Length of Stay : 59.0
- Average Length of Stay : 3.6875
- No. of Early Claims : 0
- No. of Frequent Re-admission Sam...



ID : 849146

Age : 22
Occupation : TEACHER
Number of Policies : 2

RISK FUNCTIONS

- No. of Claims : 28
- Total Claim Amount : 125K
- Average Claim Amount : 4.4K
- Total Length of Stay : 106.0
- Average Length of Stay : 5.0476190...
- No. of Early Claims : 0
- No. of Frequent Re-admission Sam...

CLIENTS OUTLIERS

All ICD Codes

Grouping By: All Segments

Outlier Feature

- All ICD Codes
- Top 10 ICD Codes Based on No. Of Claims
- Top 10 ICD Codes Based on Claim Amount
- Top 10 ICD Codes Based on Avg Claim Amount

| Clients | NUMBER OF CLAIMS | TOTAL CLAIM AMOUNT | AVERAGE CLAIM AMOUNT | TOTAL LENGTH OF STAY | AVERAGE LENGTH OF STAY | NUMBER OF EARLY CLAIMS | NUMBER OF FREQUENT RE-ADMISSION SAME CODE | NUMBER OF FREQUENT RE-ADMISSIONS DIFFERENT CODE |
|---------|------------------|--------------------|----------------------|----------------------|------------------------|------------------------|---|---|
| 1480658 | 1.00 | 1.00 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 0.28 |
| 1495638 | 1.00 | 0.11 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 0.42 |
| 1229317 | 0.62 | 0.51 | 0.00 | 0.00 | 0.00 | 0.10 | 0.90 | 0.36 |
| 511 | 0.53 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.92 | 1.00 |
| 849146 | 0.63 | 0.17 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 0.57 |
| 933756 | 1.00 | 0.04 | 0.00 | 0.02 | 0.00 | 0.00 | 0.60 | 0.70 |
| 1175713 | 1.00 | 0.05 | 0.00 | 0.00 | 0.00 | 0.00 | 0.95 | 0.29 |
| 796476 | 0.24 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 1.00 | 1.00 |
| 997188 | 0.21 | 0.00 | 0.00 | 1.00 | 1.00 | 0.00 | 0.00 | 0.00 |

CODE : PNG0013

Name : HOSPITAL LAM WAH EE

Group : Individual

Location : I0113

RISK FUNCTIONS

No. of Claims : 12594.0

Total Claim Amount : 27M

Average Claim Amount : 2K

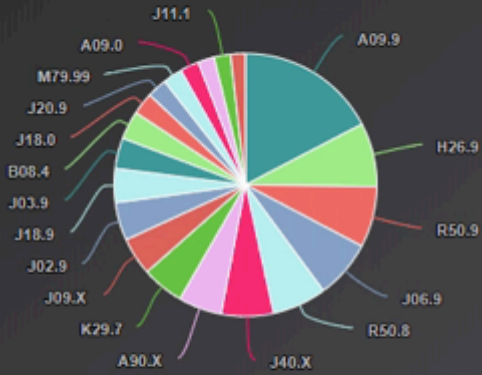
Total Length of Stay : 40702.0

Average Length of Stay : 4.506920607

No. of Early Claims : 145.0

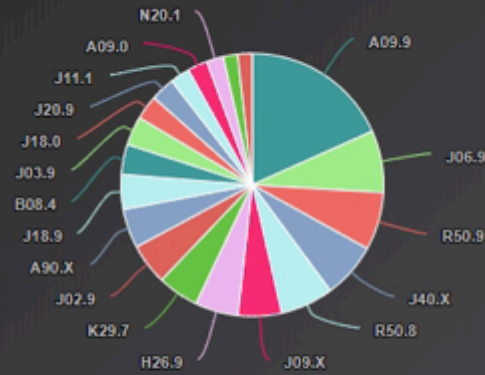
No. of Frequent Re-admission Same Code : 5382.0

Distribution of Claims across Top 20 ICD Codes



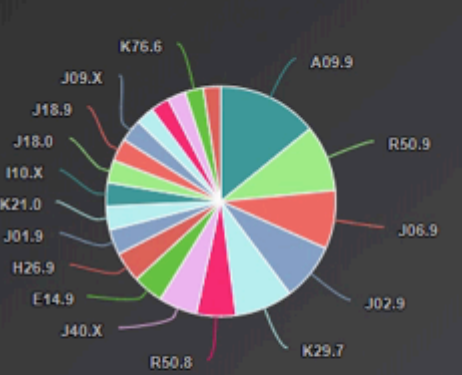
Aida Technologies

Distribution of Same Re-Admissions across Top 20 ICD Codes



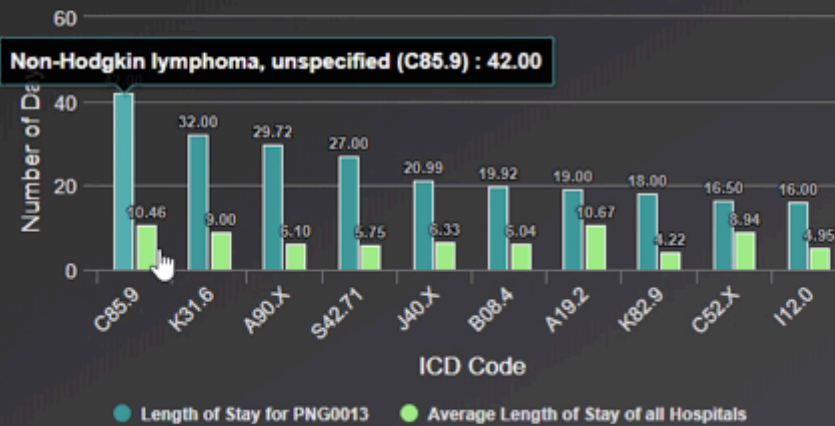
Aida Technologies

Distribution of Different Re-Admissions across Top 20 ICD Codes



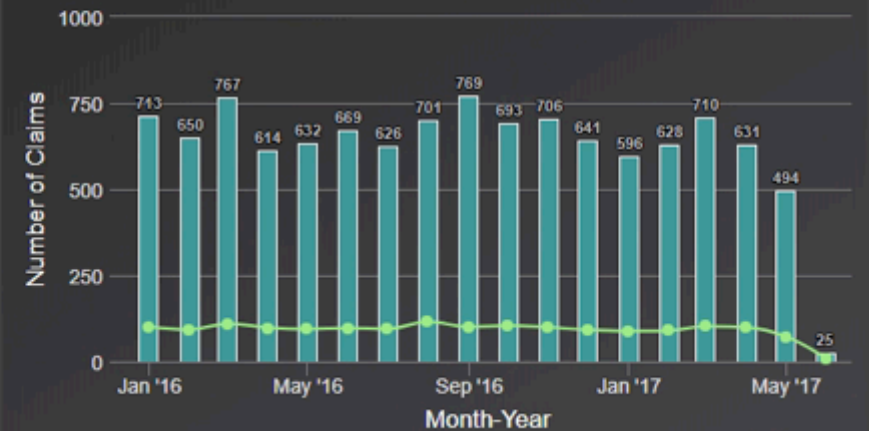
Aida Technologies

Top 10 ICD Codes (By Avg. Length of Stay)



Aida Technologies

Number of Claims across Time



Aida Technologies

AGENTS OUTLIERS

All ICD Codes

Grouping By: All Segments

Outlier Feature

All ICD Codes Top 10 ICD Codes Based on No. Of Claims Top 10 ICD Codes Based on Claim Amount Top 10 ICD Codes Based on Avg Claim Amount



ID : KT100003

Number of Outlier Clients : 19
Number of Clients : 244



ID : K5800002

Number of Outlier Clients : 18
Number of Clients : 154



ID : PH100006

Number of Outlier Clients : 18
Number of Clients : 154



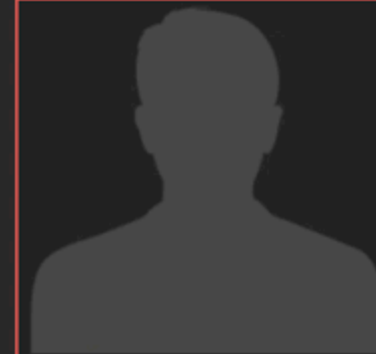
ID : K1100002

Number of Outlier Clients : 17
Number of Clients : 255



ID : A0700167

Number of Outlier Clients : 16
Number of Clients : 78



ID : MK800007

Number of Outlier Clients : 16
Number of Clients : 92



RISK ANALYSIS - HEATMAP



HOME ANALYSIS TOP CLIENTS TOP OUTLIER CLIENTS

CLIENTS OUTLIERS

Filter Products

All EOI-Codes Top 10 EOI-Codes Based on No. Of Claims Top 10 EOI-Codes Based on Claims Amount Top 10 EOI-Codes Based on Avg Claims Amount

**Patients
Risk**

**Doctors and
Surgeons
Risk**

**Hospitals
and Clinics
Risk**

**Agents
Risk**

| | | | | | | | | | |
|--------|------|------|------|------|------|------|------|------|------|
| 100100 | 0.21 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |
| 100100 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |
| 100100 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |

Top 1

Generate Report

1 2 3 4 5



**AIDA – SMART-CLAIMS
Business Case Analysis**

AI Driven Analytics

AIDA SMART-Claims

Key Benefits of Machine Learning for Claims Processing:

✓ OPERATIONAL BENEFITS - Cost Per Claim Reduction

| Number of Claims Per Month | Cost of Processing Per Claim (Dollars) | Total Claims Processing Cost Per Month (Dollars) | % of STP Claims Through ML Engine | Reduction in Cost of Processing Per Claim (Dollars) | Total Cost Savings in Claims Processing Per Month (Dollars) |
|----------------------------|--|--|-----------------------------------|---|--|
| 10000 | 50 | 500,000 | @ 50 % | 25 | 250,000 |
| 20000 | 40 | 800,000 | @ 60 % | 24 | 480,000 |
| | | | | | |

@ 240,000 Claims Per Annum
@ 40 Dollars Per Claim
@ 60% STP Through Machine Learning
Potential Savings Per Annum: \$5.76 Million

AIDA SMART-Claims Introduction

Key Benefits of Machine Learning for Claims Processing:

- ✓ **Significant Cost Savings (>\$5M/annum for 20K claims/month)**
- ✓ **Faster Claims Turn-Around (days to seconds)**
- ✓ **Augmented Intelligence to Support Specialist Claims Officers**
- ✓ **Organisational Knowledge by Continuous Learning By Machines**
- ✓ **Scalable to Increased Claim Volumes**
- ✓ **Early Detection of Potentially Suspicious and Unusual Claims**



AIDA – SMART-CLAIMS

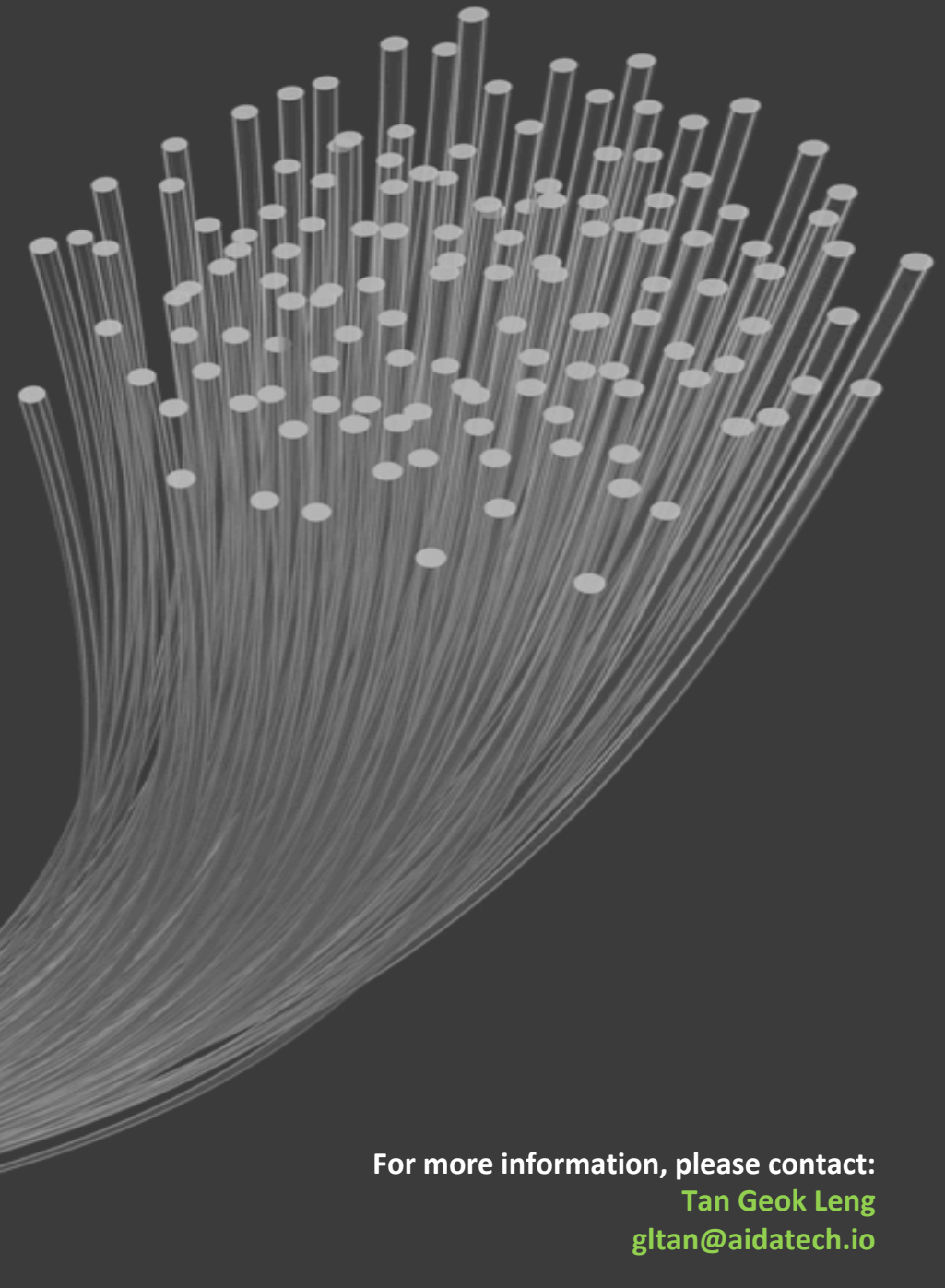
Taking the Solution from Singapore into the region.

AI Driven Analytics



Taking AIDA's Smart Claims beyond Singapore into Thailand, Indonesia, Malaysia, Hong Kong and Japan

Thank **YOU!**



For more information, please contact:
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gltan@aidatech.io