

.conf2015

Using Splunk for Program Integrity in Health and Human Services

Bharane Balasubramanian
Deloitte & Touche LLP

Jatinder Sharma
Deloitte & Touche LLP



Disclaimer

During the course of this presentation, we may make forward looking statements regarding future events or the expected performance of the company. We caution you that such statements reflect our current expectations and estimates based on factors currently known to us and that actual events or results could differ materially. For important factors that may cause actual results to differ from those contained in our forward-looking statements, please review our filings with the SEC. The forward-looking statements made in the this presentation are being made as of the time and date of its live presentation. If reviewed after its live presentation, this presentation may not contain current or accurate information. We do not assume any obligation to update any forward looking statements we may make.

In addition, any information about our roadmap outlines our general product direction and is subject to change at any time without notice. It is for informational purposes only and shall not, be incorporated into any contract or other commitment. Splunk undertakes no obligation either to develop the features or functionality described or to include any such feature or functionality in a future release.

Agenda

- Healthcare program integrity
 - High-risk behaviors and activities
 - Internal and external monitoring
- Splunk for healthcare program integrity
 - Onboarding the data
 - Processing & analyzing the data
 - Presenting the data
- Q&A



Introduction

Bharane Balasubramanian



Manager

Deloitte & Touche LLP

- Over 10 years of cybersecurity experience
- Industry: Public Sector
- Certifications: CISSP, CIPP, CEH and SSCP

Jatinder Sharma



Senior Consultant

Deloitte & Touche LLP

- Over 2 years of cybersecurity experience
- Over 3 years of Splunk experience
- Certifications: Splunk Certified Architect

As used in this document, 'Deloitte' means Deloitte & Touche LLP, a subsidiary of Deloitte LLP. Please see www.deloitte.com/us/about for a detailed description of the legal structure of Deloitte LLP and its subsidiaries. Certain services may not be available to attest clients under the rules and regulations of public accounting.



.conf2015

Introduction to Program Integrity

An Overview of the Medicaid Program

- Every year, Medicaid covers medical expenses for more than **57 million** beneficiaries enrolled **in 56 States and territory-administered programs**
- According to the US Government Accountability Office (GAO), the cost of this coverage in 2011 was **\$427 billion**
- Medicaid payments during 2011, including fraud, waste, and abuse, amounted to **\$21.9 billion**
- GAO Has designated Medicaid as a program that is at **high risk** for improper payments

Source: CMS Program Integrity

<https://www.cms.gov/Medicare-Medicaid-Coordination/Fraud-Prevention/Medicaid-Integrity-Education/fwa.html>

Medicaid Fraud, Waste, and Abuse

- Wasteful, fraudulent and abusive behaviors occur across HHS programs. These actions can be committed by providers, recipients and department staff alike
- Fraud Waste and Abuse Hinder departments from administering and delivering program services that are integrated, fiscally responsible, person-centered, accountable and sustainable
- Key highlights on the Fraud, Waste and Abuse trend:
 - \$21.9 billion of improper payments in the year 2011
 - In FY2012, over \$4 billion was recovered through the government's health care fraud enforcement efforts
 - State governments recovered over \$2.9 billion in FY2012 and over \$1.7 billion in FY2011

Source: CMS Program Integrity

<https://www.cms.gov/Medicare-Medicaid-Coordination/Fraud-Prevention/Medicaid-Integrity-Education/fwa.html>

To Prevent, Predict, Detect & Monitor is Key



Pre-payment

Improving pre-payment through better rules and models is essential to reducing overall program costs



Post-payment

Exploring post-payment data still has enormous value



Managed care

Identifying Fraud, Waste and Abuse (FWA) in managed care is essential for states to better negotiate capitated rates with Managed Care Organizations (MCO) and identify fraud not visible to individual MCOs

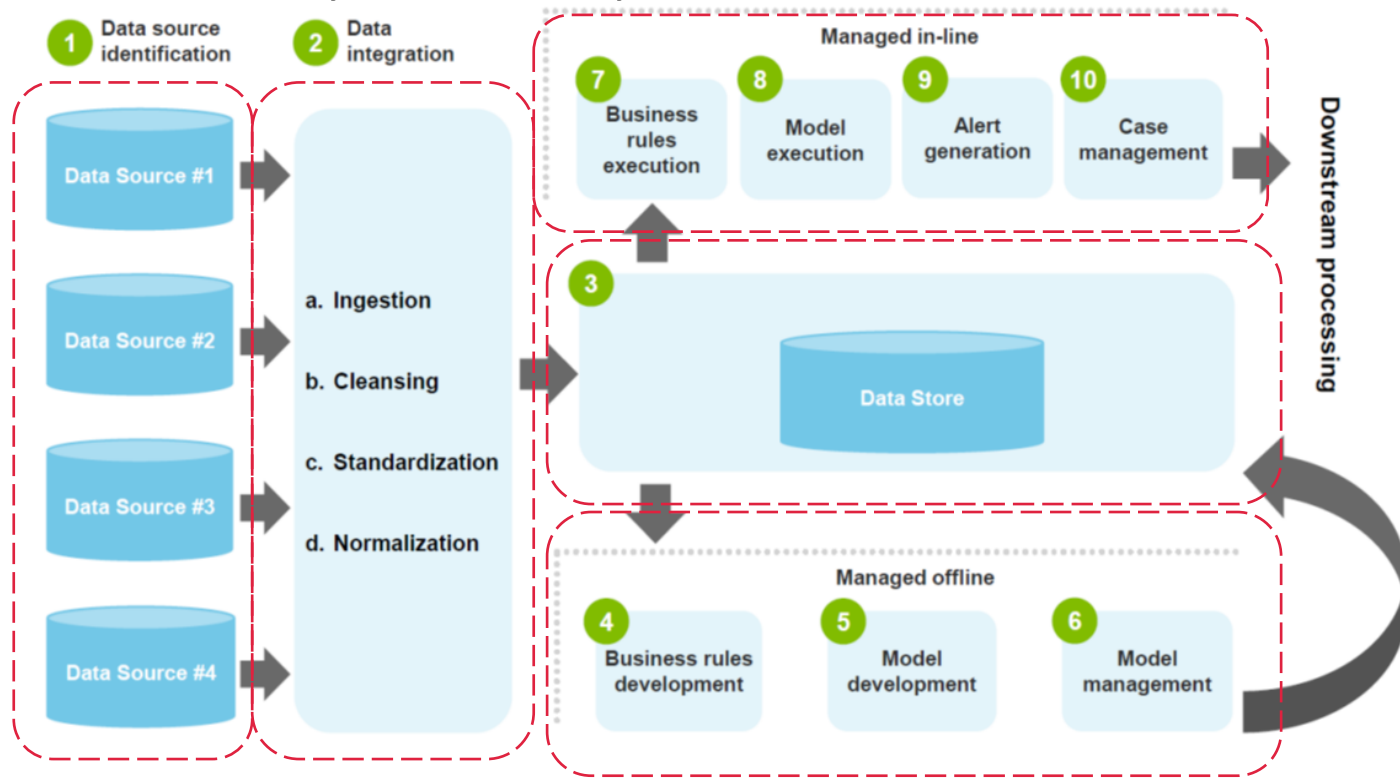


Fee-for-service

Identifying FWA in Fee-For-Service (FFS) claims through exploratory analytics is essential to develop new indicators and associated new rules and models.

Copyright © 2015 Deloitte Development LLC. All rights reserved.

Building Blocks to Prevent, Predict, Detect & Monitor



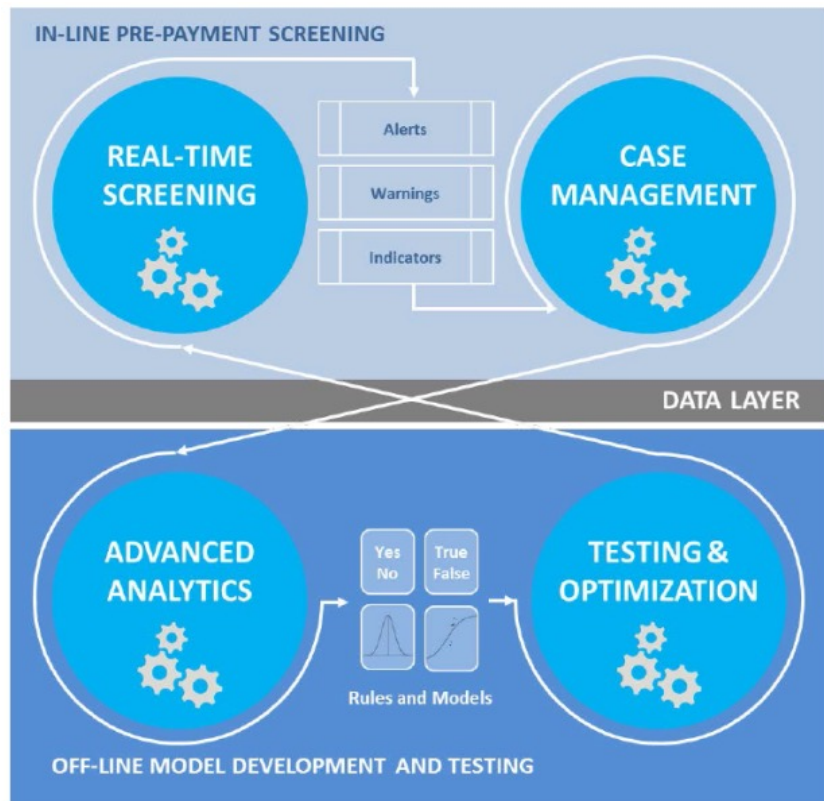
Copyright © 2015 Deloitte Development LLC. All rights reserved.



.conf2015

Use of Splunk for Near Real-Time Detection (Pre-Payment)

Implementation of Pre-payment Analysis



splunk>

Locate and analyze high-risk transactions

Enable cross-checking federal and state benefits paid to clients

Reduce time for fraud detection

Benefit correlation

Worker overrides

Duplication of cases



Business Analytics/
Intelligence

Copyright © 2015 Deloitte Development LLC. All rights reserved.

Use Cases

- 1 • Monitor multiple instances of the same case for the same individual
- 2 • Multiple overrides performed by a worker
- 3 • Monitor One Time Issuance (OTI) cases amount exceeding the threshold value
- 4 • Identify Special Program Request by case
- 5 • Detect members of the same household receiving the same benefit
- 6 • Skipping over SSN verification needs for a case

Use Case - Definition

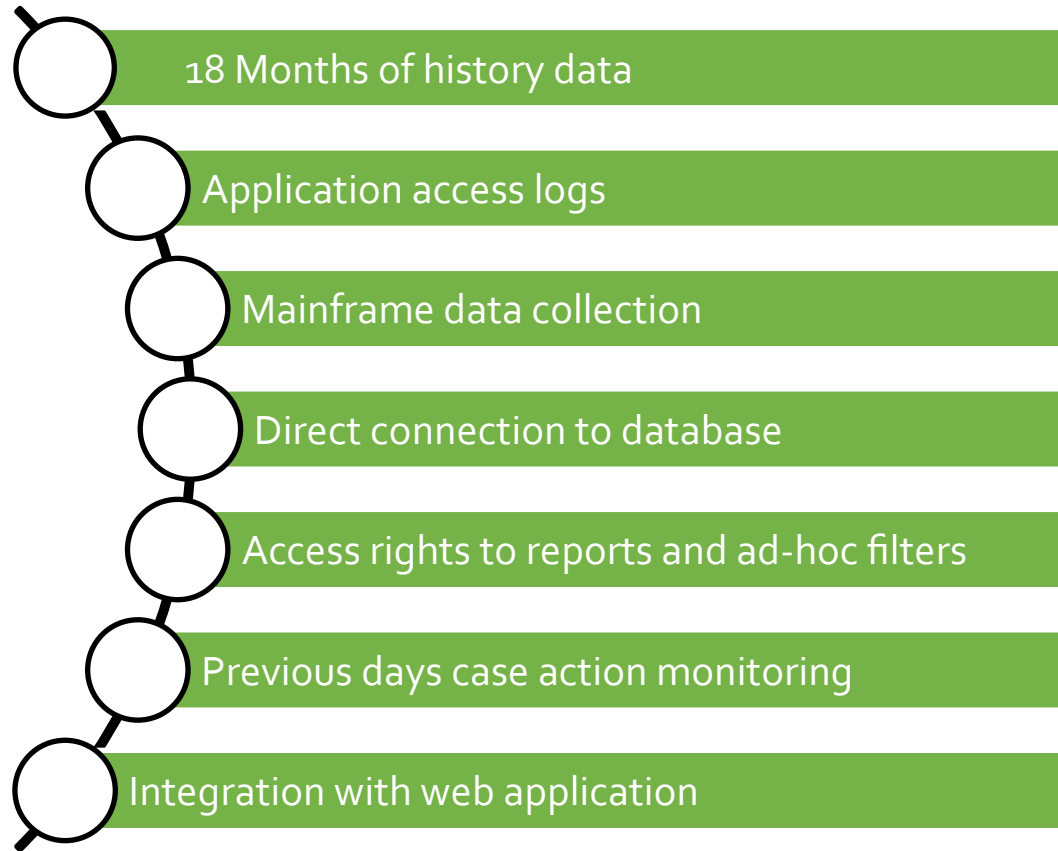
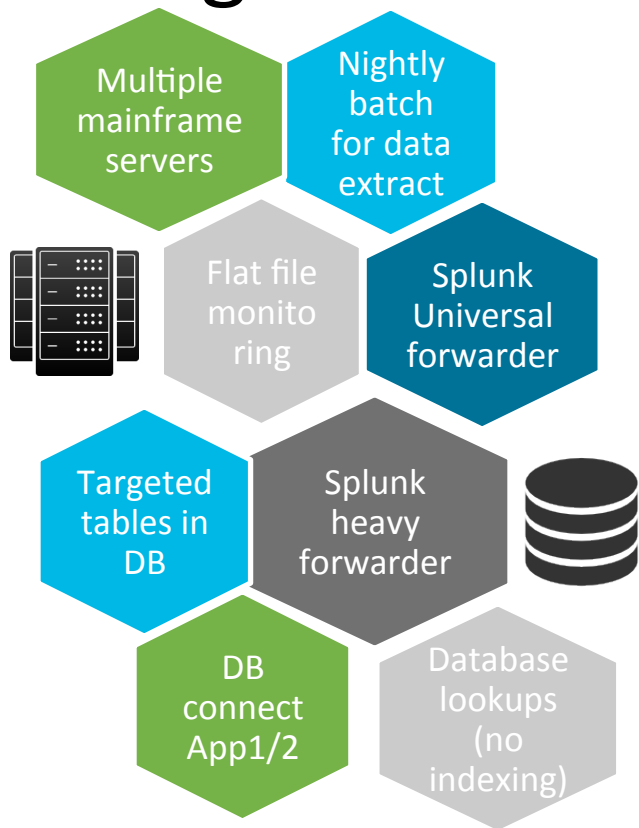
Use case	Business Requirement	Outcome
1. Individual applies frequently for benefits or is requesting retroactive benefits.	<ul style="list-style-type: none">• Non-Continuous Eligibility (NCE) should only be issued in increments and non-continuous by design.• There should not be recurring instances of NCEs on the same case for the same individuals.	Identified a list of cases or users with recurring NCE segments within a given timeframe across several benefit programs.
2. Perform case overrides, nullifying the system results.	<ul style="list-style-type: none">• Overrides should not be performed excessively as there may be limited oversight.• Overrides bypasses the eligibility rules that were designed in the system.• Lack of oversight on overrides may lead to benefits provided to not valid cases.	Detected cases where repetitive overrides are performed by a case worker within a given timeframe across several benefit programs.
3. Skip Social Security Number (SSN) Verification requirements.	<ul style="list-style-type: none">• SSN Verification is required for open-cases• During certain scenarios, SSN verification is not required. If this condition is inappropriately used, benefits can be provided to incorrect individuals.	Identified a list of cases where a worker has used verification code of “Not Required” for an individual’s SSN verification within a given timeframe.

Use Case - Definition

Use Case	Business Requirement	Outcome
4. One Time Issuances (OTI) by Case or by Supervisor	<ul style="list-style-type: none">• OTIs can be issued for any value• Agency specifies threshold for review• To avoid potential fraudulent transactions, it is essential to review all OTI issuances though it's below agency threshold.	Documented a list of cases or case workers where the One Time Issuance (OTI) amount exceeds a program office selected amount within a given timeframe. This can be cumulative across cases or for a single case.
5. Special program requests by Case	<ul style="list-style-type: none">• Special program requests should not be performed excessively due to limited oversight• Special program requests bypasses the traditional eligibility rules.	Provided a list of cases where a Special Program Request was made by a worker within a given timeframe.
6. Assign Supplemental Nutrition Assistance Program (SNAP) benefits to individuals who may reside in same household where they are receiving Heating Benefits.	<ul style="list-style-type: none">• Members of the same household receiving heating benefits can exist as active members on multiple SNAP cases – Individuals live in same household, but they purchase and prepare food separately	This report will provide a list of cases where the household members receiving heating benefits exists as active members on multiple (more than two additional) SNAP cases.

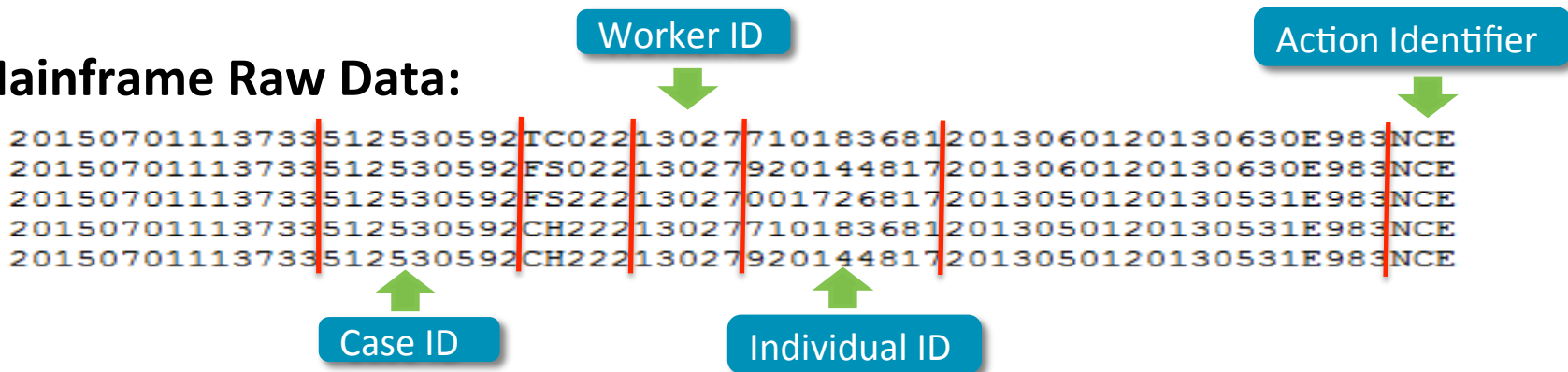
Copyright © 2015 Deloitte Development LLC. All rights reserved.

Challenges



Raw Data Configuration

Mainframe Raw Data:

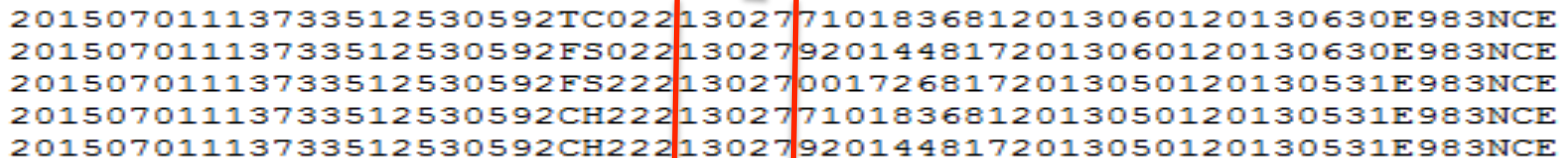


Regex:

```
^(?P<Authorization_Date>.{14})\s(?P<Case_ID>.{9})(?P<Category_Code>.{3})(?P<Grant_Group>.{1})(?P<Program_Status_Code>.{2})(?P<Worker_ID>.{5})(?P<Individual_ID>.{9})(?P<Benefit_Begin_Date>.{8})(?P<Benefit_End_Date>.{8})(?P<Override_Date>.{8})(?P<Override_Reason>.{3})(?P<Notice_Option>.{1})(?P<NCE_Notice_Reason_Code>.{3})(?P<Action_Identifier>.{4})
```

Database Lookup

- Database lookup on Worker ID



```
20150701113733512530592TC022130277101836812013060120130630E983NCE
20150701113733512530592FS022130279201448172013060120130630E983NCE
20150701113733512530592FS222130270017268172013050120130531E983NCE
20150701113733512530592CH222130277101836812013050120130531E983NCE
20150701113733512530592CH222130279201448172013050120130531E983NCE
```

Lookup Name

mainframe: LOOKUP-Worker ID = lookup_workerid mainframe_WORKER_ID AS Worker_ID
OUTPUTNEW Database_WORKER AS DB_WORKER

- Results

✓ 13027= username1

Output

Input

Use Case 1: Searches

- **Non-Continuous Eligibility (NCE) Segments by Case**

1
2
3
index="mainframe" sourcetype="mainframe" `NCE_Action_Identifier` | search \$Program_Type\$ | stats count as nce_duplicate_program_count by Case_ID | sort -nce_duplicate_program_count | where nce_duplicate_program_count >= \$nce_duplicate_program_count\$ | rename Case_ID as "Case Record No", nce_duplicate_program_count as "Number of NCEs" 2

- **Non-Continuous Eligibility (NCE) Segments by Worker**

1
2
3
index="mainframe" sourcetype="mainframe" `NCE_Action_Identifier` | search \$Program_Type\$ | eval Worker_ID = upper(DB_WORKER) | stats count as nce_duplicate_program_count by Worker_ID | sort -nce_duplicate_program_count | where nce_duplicate_program_count >= \$nce_duplicate_program_count\$ | rename Worker_ID as "Worker ID", nce_duplicate_program_count as "Number of NCEs" 2

Use Case 1: Display Results

Non-Continuous Eligibility (NCE) Segments by Case

This report will provide a list of cases which have repetitive Non-Continuous Eligibility (NCE) segments within a given timeframe. Please select the number of repetitive NCEs and enter a date range to generate the report.

Select the Number of NCEs: Select a Time Frame: Select Program Type(s):

Select a Case Record Number to view the NCE details Results Returned 5 Record(s)

Case Record No	Number of NCEs
221353424	21
134677127	14
221353421	14
221353984	14
221312924	7

Export to Excel

NCE Details for Case Record Number 221353424

Worker ID	Category Code	Program Status Code	Individual #	Begin Date	End Date	Authorized Date
T-TESTSHAW	C	00	67891431	12-OCT-14	12-NOV-14	12-OCT-14
T-TESTJASO	MA	00	67891431	09-OCT-14	10-OCT-14	09-OCT-14
T-TESTSHAW	C	00	67891431	09-OCT-14	10-OCT-14	09-OCT-14
T-TESTSHAW	C	00	67891431	12-OCT-14	12-NOV-14	12-OCT-14
T-TESTJASO	MA	00	67891431	09-OCT-14	10-OCT-14	09-OCT-14
T-TESTSHAW	C	00	67891431	09-OCT-14	10-OCT-14	09-OCT-14
T-TESTSHAW	C	00	67891431	12-OCT-14	12-NOV-14	12-OCT-14

1. Filtered case record number for action identifier

2. User input values

3. Results based on threshold value

Use Case 2: Inputs

List of Reports ▾

One Time Issuance (OTI) Amount by Case

This report will provide a list of cases where the One Time Issuance (OTI) amount exceeds a selected amount within a given timeframe. Please enter a threshold amount, enter a date range and select the Submit button to generate the report. You may also select to filter the threshold on single OTIs or cumulative OTIs per case.

Enter an OTI Threshold Amount:

Select a Time Frame: Total Single Last 30 days Submit

XML Input:

```
<input type="radio" searchWhenChanged="false"
token="input_report_type">
<label></label>
<default>Single</default>
<choice value="| stats sum(AMOUNT) as Total_Amount by
IDN_CASE | where Total_Amount >=">Total</choice>
<choice value="| table USER_CHANGE_LAST, AMOUNT | rename
AMOUNT as Total_Amount | where Total_Amount >=">Single</
choice>
</input>
```

```
<input type="radio" searchWhenChanged="false"
token="input_report_type">
<label></label>
<default>Single</default>
<choice value="| stats sum(AMOUNT) as Total_Amount by
IDN_USER_CHANGE_LAST | where Total_Amount
>=">Total</choice>
<choice value="| table USER_CHANGE_LAST, AMOUNT |
rename AMOUNT as Total_Amount | where Total_Amount
>=">Single</choice>
</input>
```

Use Case 2: Searches

One Time Issuance (OTI) Amount by Case

```
index=database_1 sourcetype=database_1 source="dbmon-tail://database_1/table_OTI"  
| eval IDN_CASE=if(len(IDN_CASE) = 8,"0"+IDN_CASE,IDN_CASE) 1
```

```
2 $input_report_type$ $Total_Amount$ 3
```

```
| eval Total_Amount=round(Total_Amount,2) | sort -Total_Amount | rename IDN_CASE as "Case  
Record No", Total_Amount as "OTI Amount"
```

Use Case 2: Display Results

splunk> Jatinder Sharma

List of Reports ▾

One Time Issuance (OTI) Amount by Case

This report will provide a list of cases where the total One Time Issuance (OTI) amount exceeds a selected amount within a given timeframe. Please enter a threshold amount and a date range to generate the report.

Enter an OTI Threshold Amount: Select a Time Frame: Total Single All time Submit

Select a Case Record Number to view the OTI details Results Returned 202 Record(s)

Case Record No	OTI Amount
280123832	2279.00
400847147	2138.00
390309635	2112.00
650446016	1999.90
400838581	1780.00
513780965	1673.00
220360085	1500.00
400806770	1375.50
21552445	1363.50
670279585	1264.00
220348075	1207.00
230607372	1164.00
250488428	1137.00
513499170	1072.00
450134361	1054.00

Export to Excel


Copyright © 2015 Deloitte Development LLC. All rights reserved.

Use Case 2: Drill-Down Details

One Time Issuance (OTI) Amount by Case – Drill Down Details

OTI Details for Case Record Number: 280123832

Supervisor ID ↕	OTI Amount ↕	Issuance Date ↕	Category Code ↕	Program Status Code ↕
LHUNT	793.00	04-OCT-13	FS00	00
LHUNT	793.00	04-OCT-13	FS00	00
LHUNT	793.00	04-OCT-13	FS00	00

[Export to Excel](#) 

Use Case 3: Searches

Heat Cases with Multiple SNAP Cases

- 1 `index=database sourcetype=database source="dbmon-tail://database_heat" | rename IDN_INDIV as Individual_ID | join type=inner Individual_ID [search index=mainframe sourcetype=mainframe Category_Code="*FS*"] (stats dc(Case_ID) as count by IDN_CASE) |`
- 2 `where count > 2 | rename IDN_CASE as "Heat Case Record No", count as "Number of Associated SNAP Cases"`

Cases associated to Heat Case Record Number

- 1 `index=database sourcetype=database IDN_ACTION=LMS $Heat Case Record No$ | rename IDN_INDIV as Individual_ID | join type=inner Individual_ID [search index=mainframe sourcetype=mainframe Category_Code="*FS*"] | table case_id, worker_id, Individual_ID | rename case_id as "SNAP Case Record No", worker_id as "Worker ID", Individual_ID as "Individual #"`

Use Case 3: Display Results

Cases with multiple SNAP Cases

This report will provide a list of cases where household members of one case exist as active members on multiple SNAP cases (i.e. the individuals live in the same household, but they purchase and prepare food separately.) Please select the threshold number of SNAP cases and enter a date range to generate the report.

Select a Time Frame:

Select a Case Record Number to view the associated case details

Results Returned: 2 Record(s)

Case Record No	Number of Associated SNAP Cases
134677456	4
134677777	3

[Export to Excel](#)

Cases associated to Case Record Number: 134677456

SNAP Case Record No	Worker ID	Individual #
134677200	77891007	77891007
134677150	77891006	77891006
134677150	77891005	77891005
134677100	77891004	77891004
134677100	77891003	77891003
134677456	77891002	77891002
134677456	77891001	77891001

[Export to Excel](#)

Copyright © 2015 Deloitte Development LLC. All rights reserved.

Use Case 4: Summary Index

```
index=sat_icis sourcetype=sat_ecis_risk_audit source="dbmon-tail://eCIS_Database_RISK_AUDIT_SAT/V_RISK_AUDIT_SSN_MCI" | rename IDN_CLIENT as IDN_INDIV,
time as Max_SSN_Verification_Date
| join type=inner IDN_INDIV, Max_SSN_Verification_Date
[search index=sat_icis sourcetype=sat_ecis_risk_audit source="dbmon-tail://eCIS_Database_RISK_AUDIT_SAT/V_RISK_AUDIT_SSN_MCI" | fields source, IDN_CLIENT,
CDE_VERIF_SSN, _time | rename IDN_CLIENT as IDN_INDIV, _time as SSN_Verification_Date
| join type=inner IDN_INDIV
[ search index=sat_icis sourcetype=sat_ecis_risk_audit source="dbmon-tail://eCIS_Database_RISK_AUDIT_SAT/V_RISK_AUDIT_SSN_CASE_INDIV" | fields IDN_CASE,
IDN_INDIV
| join type=inner IDN_CASE
[ search index=sat_icis sourcetype=sat_ecis_risk_audit source="dbmon-tail://eCIS_Database_RISK_AUDIT_SAT/V_RISK_AUDIT_SSN_WKFLW_AUDIT"
CDE_TRANS_AUDIT_WKFLW = "CC" | rename _time as Case_Commit_Date | fields IDN_CASE, IDN_USER_CRTD, CDE_TRANS_AUDIT_WKFLW, Case_Commit_Date]]
| join type=inner IDN_CASE
[search index=sat_icis sourcetype=sat_ecis_risk_audit source="dbmon-tail://eCIS_Database_RISK_AUDIT_SAT/V_RISK_AUDIT_SSN_Heat" ]
| table _time, IDN_CASE, IDN_INDIV, IDN_USER_CRTD, CDE_VERIF_SSN, SSN_Verification_Date, Case_Commit_Date | eval IDN_WORKER = upper(IDN_USER_CRTD) |
table IDN_CASE, IDN_INDIV, IDN_WORKER, SSN_Verification_Date, CDE_VERIF_SSN, Case_Commit_Date | stats max(SSN_Verification_Date) as
Max_SSN_Verification_Date by IDN_CASE, IDN_INDIV, IDN_WORKER, Case_Commit_Date]
| dedup IDN_CASE IDN_INDIV
| rename Max_SSN_Verification_Date as _time
| table _time, IDN_CASE, IDN_INDIV, IDN_WORKER, CDE_VERIF_SSN
```

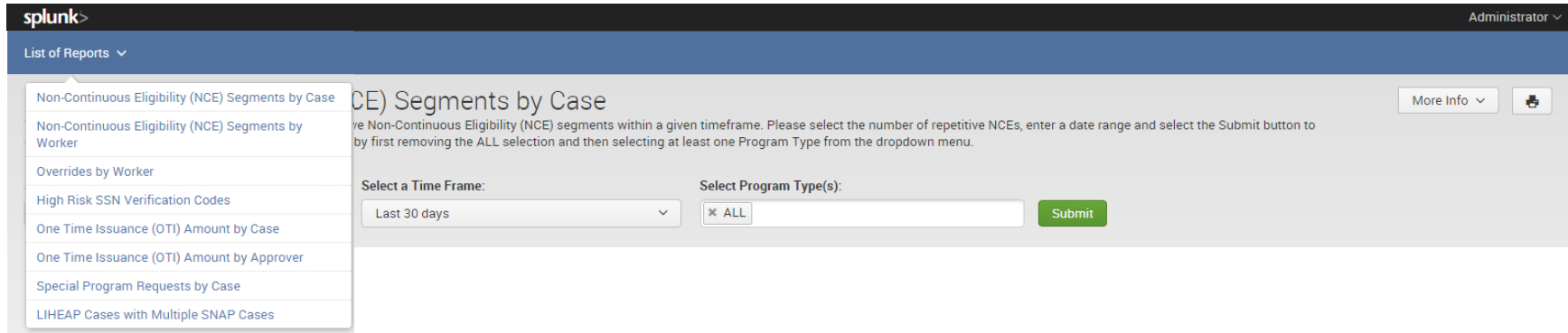
- Over 40 million records joins
- Reduce over 8 hours to 40 minutes
- Detects every update by a worker

Permissions and User Access

splunk> App List of Reports ▾	Administrator ▾ Messages ▾ Settings ▾ Activity ▾ Help ▾ Find
<pre>.shared-splunkbar-systemmenu { display:none !important; } .shared-splunkbar-messages { display:none !important; } .shared-splunkbar-activitemenu { display:none !important; }</pre>	<pre>.shared-splunkbar-helpmenu { display:none !important; } .shared-splunkbar-find { display:none !important; } .shared-splunkbar-appmenu { display:none !important; }</pre>

Copyright © 2015 Deloitte Development LLC. All rights reserved.

Custom App



- User permissions in Splunk
- Ad-hoc report list

Hide Panels on Report Load

splunk> Jatinder Sharma

List of Reports ▾

Non-Continuous Eligibility (NCE) Segments by Case

This report will provide a list of cases which have repetitive Non-Continuous Eligibility (NCE) segments within a given timeframe. Please select the number of repetitive NCEs and enter a date range to generate the report.

Edit ▾ More Info ▾ ⬇️ ⚙️

Select the Number of NCEs: ⚙️

Select a Time Frame: ▾

Select Program Type(s): ▾

Click Submit to show results

splunk>

Copyright © 2015 Deloitte Development LLC. All rights reserved.

Java Script to Hide/Unhide Panels

```
require(['jquery', 'splunkjs/mvc/simplexml/ready!'], function($)
{
    $("#search_btn").click( function()
    {
        $(".dashboard-row1").css('display', 'block');
        $(".dashboard-row2").css('display', 'none');

    });

    $("#panel1").click( function()
    {
        $(".dashboard-row2").css('display', 'block');

    });
});
```

```
<div class="form-submit" id="search_btn">
  <button class="btn btn-primary submit">Submit</button>
</div>

<div id="row1" class="dashboard-row dashboard-row1">
  <div id="panel1" class="dashboard-cell" style="width: 100%;">
    <div class="dashboard-panel clearfix">

<div id="row2" class="dashboard-row dashboard-row2">
  <div id="panel2" class="dashboard-cell" style="width: 100%;">
    <div class="dashboard-panel clearfix">

<div id="row2" class="dashboard-row dashboard-row2">
  <div id="panel2" class="dashboard-cell" style="width: 100%;">
    <div class="dashboard-panel clearfix">
```

Display Result Count on Panel

Non-Continuous Eligibility (NCE) Segments by Case

This report will provide a list of cases which have repetitive Non-Continuous Eligibility (NCE) segments within a given timeframe. Please select the number of repetitive NCEs and enter a date range to generate the report.

Select the Number of NCEs: Select a Time Frame: Select Program Type(s):

Select a Case Record Number to view the NCE details

Case Record No	Number of NCEs
221353424	21
134677127	14
221353421	14
221353984	14
221312924	7

Results Returned 5 Record(s)

[Export to Excel](#)

NCE Details for Case Record Number: 221353424

Worker ID	Category Code	Program Status Code	Individual #	Begin Date	End Date	Authorized Date
T-TESTSHAW	C	00	67891431	12-OCT-14	12-NOV-14	12-OCT-14
T-TESTJASO	MA	00	67891431	09-OCT-14	10-OCT-14	09-OCT-14
T-TESTSHAW	C	00	67891431	09-OCT-14	10-OCT-14	09-OCT-14
T-TESTSHAW	C	00	67891431	12-OCT-14	12-NOV-14	12-OCT-14
T-TESTJASO	MA	00	67891431	09-OCT-14	10-OCT-14	09-OCT-14
T-TESTSHAW	C	00	67891431	09-OCT-14	10-OCT-14	09-OCT-14
T-TESTSHAW	C	00	67891431	12-OCT-14	12-NOV-14	12-OCT-14

Copyright © 2015 Deloitte Development LLC. All rights reserved.

Java Script to Add Text and Result Count

```
$(function(){  
    $("#icis_drilldown").on("DOMNodeInserted", function(){  
        var object = $('#icis_drilldown .icon-export');  
        if(object.length == 1)  
        {  
            console.log(object);  
            $('#icis_drilldown').off("DOMNodeInserted");  
            object.before("Export to Excel: ");  
        }  
  
    });  
  
});
```

```
$(function(){  
    $("#element1").on("DOMNodeInserted", function(){  
        var object = $('#element1 .panel-body .single-result');  
        if(object.length == 1 && parseInt(object.text()) != NaN)  
        {  
            console.log(object);  
            console.log(" "+object.text()+"");  
            $('#element1').off("DOMNodeInserted");  
  
            $("#icis_drilldown .panel-head h3").append(" - ").append($  
            ("#element1 .panel-body .single-result").text());  
        }  
    });  
  
});
```

Takeaways – Be Prepared for Changes

1

ONE SIZE DOES NOT FIT ALL

Multiple approaches needed to holistically evaluate Medicaid claims for FWA

2

THINK BROADLY

Software solutions alone are not sufficient to enable advanced analytic models

3

MODEL CONTINUOUSLY

Continuous modeling is essential to eliminate false positives and adapt to emerging trends and schemes

4

YOU CAN DELEGATE RESPONSIBILITY, BUT NOT ACCOUNTABILITY

Managed care does not obviate the need to identify fraud or its cost may be passed along

5

INTEGRATE DUE DILIGENCE

Strong models and rules can be developed by testing and validating hypotheses using due diligence techniques

Copyright © 2015 Deloitte Development LLC. All rights reserved.

Questions?

This presentation contains general information only and Deloitte is not, by means of this presentation, rendering accounting, business, financial, investment, legal, tax, or other professional advice or services. This presentation is not a substitute for such professional advice or services, nor should it be used as a basis for any decision or action that may affect your business. Before making any decision or taking any action that may affect your business, you should consult a qualified professional advisor.

Deloitte shall not be responsible for any loss sustained by any person who relies on this presentation.



.conf2015

THANK YOU

splunk>