## Deloitte.

## Deloitte Analytics

 Applying Process Mining in an audit context

Process Mining Camp - June 4 ${ }^{\text {th }} 2012$

## 7 Steps

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## Step 1: Interview



## Step 2: Data dump

Current projects $\longrightarrow$ SAP related

- Approach up till now: data request -> ABAP-file to be written by client
- New: data extraction tool of Deloitte OR own ABAP-file


## Step 3: Event log creation



## Step 3: Event log creation



## Step 4 - Process Mining

-Log description
-Pattern description
-Longest traces
-Depicting general model
-Depicting all behavior
-Originator-role -> Segregation of Duties
-Client specific internal control testing
-Social network

## Log description

|  | Key data |  |
| :--- | ---: | :--- |
|  |  | 41536 |
| Cases | 8 |  |
| Activities | 281513 |  |
| Events | 64 |  |
| Resources | $19-05-2009$ |  |
| Start | $15-11-2011$ | 1317 |
| End | 1317 different patterns are <br> found to execute the <br> procurement process. |  |
| Variants |  |  |

## Number of events over time

Events over time
Active cases over time
Case variants
Events per case
Case duration


## 10 most frequent paths

|  | Pattern | Absolute frequency | Relative frequency | Total PO value | Average PO value |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | CreatePO -InvoiceReceipt - GoodsReceipt - Payment | $16824$ | $52.08^{\circ}$ | $8872 \text { 192.21€ }$ | $527.35 €$ |
| 2 | CreatePO - GoodsReceipt - InvoiceReceipt - Payment | 13387 | 41.44 | $15654633.96 €$ | $1169.39 €$ |
| 3 | CreatePO - ChangeValue - GoodsReceipt - InvoiceReceipt Payment | 161 | 0.5\% | $1741846.61 €$ | 10 818.92€ |
| 4 | CreatePO - GoodsReceipt - InvoiceReceipt - InvoiceReceipt Payment | 48 | 0.15\% | 411 395.26€ | $8570.74 €$ |
| 5 | CreatePO -InvoiceReceipt - InvoiceReceipt - GoodsReceipt Payment | 41 | 0.13\% | 357 902.00€ | $8729.32 €$ |
| 6 | CreatePO - GoodsReceipt - InvoiceReceipt - Payment InvoiceReceipt - InvoiceReceipt - Payment - Payment | 35 | 0.11\% | 44 624.93€ | $1275.00 €$ |
| 7 | CreatePO - GoodsReceipt - GoodsReceipt - InvoiceReceipt InvoiceReceipt - Payment | 30 | 0.09\% | $35088.15 €$ | $1169.61 €$ |
| 8 | CreatePO - Sign1 - Sign2 - GoodsReceipt - InvoiceReceipt Payment | 27 | 0.08\% | 56 189.46€ | $2081.10 €$ |
| 9 | CreatePO - ChangeValue - ChangeValue - GoodsReceipt InvoiceReceipt - Payment | 27 | 0.08\% | 323 183.99€ | $11969.78 €$ |
| 10 | CreatePO - GoodsReceipt - GoodsReceipt - InvoiceReceipt InvoiceReceipt - Payment - Payment | 26 | 0.08\% | $89511.73 €$ | $3442.76 €$ |
|  | Total | 30606 | 94.74\% |  | 901.35€ |

## 10 cases with longest trace

| Case_ID | Number of <br> events | PO_Value | Throughput time |
| ---: | ---: | ---: | ---: |
| 45000854681 | 622 | $190.78 €$ | 71d |
| 45000838431 | 629 | $1196.00 €$ | 49 d |
| 45000778601 | 636 | $599.19 €$ | 34 d |
| 45000688091 | 820 | $837.16 €$ | 56 d |
| 45000871321 | 1151 | $62.81 €$ | 35 d |
| 45000750741 | 1442 | $101.58 €$ | 56 d |
| 450006872910 | 1682 | $580608.00 €$ | 87 d |
| 450007468310 | 2161 | $787968.00 €$ | 56 d |
| 450007638910 | 3961 | $1330560.00 €$ | 90 d |
| 450008080610 | 6161 | $856627.20 €$ | 145 d |
|  |  |  |  |
|  |  |  |  |
|  | Number of activities <br> performed on that <br> case |  |  |

## General process model

 total log

Process models with and without release strategy


## Process model - all behaviour

Depicting all behaviour in the process model shows the unstructured reality of the event log.


| Person (anonymized) | Change Value | CreatePO | Invoice <br> Receipt | Goods <br> Receipt | Sign 1 | Sign 2 | Sign 3 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 0 | 0 | 2965 | 0 | 0 | 0 |
| 2 | 3 | 23 | 23 | 0 | 0 | 0 | 0 |
| 3 | 12 | 169 | 169 | 0 | 0 | 0 | 0 |
| 4 | 8 | 99 | 110 | 0 | 0 | 0 | 0 |
| 5 | 41 | 266 | 263 | 0 | 16 | 4 | 0 |
| 6 | 0 | 0 | 0 | 14 | 0 | 0 | 0 |
| 7 | 53 | 643 | 669 | 0 | 0 | 0 | 0 |
| 8 | 0 | 0 | 0 | 0 | 76 | 35 | 0 |
| 9 | 63 | 214 | 1428 | 0 | 0 | 0 | 0 |
| 10 | 0 | 0 | 0 | 1426 | 0 | 0 | 0 |
| 11 | 282 | 1045 | 1274 | 0 | 836 | 0 | 0 |
| 12 | 25 | 224 | 231 | 0 | 962 | 297 | 0 |
| 13 | 18 | 87 | 99 | 0 | 0 | 0 | 0 |
| 14 | 0 | 0 | 0 | 5 | 0 | 0 | 0 |
| 15 | 0 | 0 | 0 | 0 | 433 | 475 | 0 |
| 16 | 0 | 0 | 2 | 0 | 0 | 0 | 0 |
| 17 | 0 | 0 | 0 | 1969 | 0 | 0 | 0 |
| 18 | 157 | 793 | 800 | 0 | 691 | 0 | 0 |
| 19 | 0 | 0 | 0 | 0 | 87 | 38 | 0 |
| 20 | 0 | 0 | 0 | 0 | 0 | 49 | 0 |
| 21 | 0 | 0 | 0 | 0 | 43 | 0 | 0 |
| 22 | 0 | 0 | 0 | 0 | 8 | 0 | 0 |
| 23 | 0 | 0 | 0 | 2 | 0 | 0 | 0 |
| 24 | 5 | 131 | 103 | 0 | 418 | 83 | 0 |
| 25 | 133 | 311 | 361 | 0 | 274 | 0 | 0 |
| 26 | 2 | 72 | 89 | 0 | 395 | 0 | 0 |
| 27 | 4 | 8 | 8 | 0 | 0 | 0 | 0 |
| 28 | 0 | 1 | 0 | 0 | 127 | 39 | 0 |
| 29 | 0 | 0 | 0 | 0 | 20 | 80 | 549 |
| 30 | 0 | 0 | 6 | 0 | 0 | 0 | 0 |
| 31 | 0 | 0 | 1 | 0 | 299 | 119 | 0 |
| 32 | 3 | 165 | 51 | 0 | 0 | 0 | 0 |
| 33 | 41 | 254 | 275 | 0 | 51 | 6 | 0 |
| 34 | 0 | 0 | 0 | 0 | 329 | 204 | 0 |
| 35 | 0 | 0 | 0 | 0 | 18 | 0 | 0 |
| 36 | 0 | 0 | 23 | 0 | 0 | 0 | 0 |
| 37 | 0 | 0 | 0 | 198 | 0 | 0 | 0 |
| 38 | 0 | 145 | 139 | 0 | 68 | 32 | 0 |

## Role-Task matrix

The role-taks matrix shows there is no segregation of authorities in the information system. This enlarges the importance of a good Segregation of Duties testing.

## Segregations of Duties

| Approval | Number of Sign's | Lower Boundary | Upper Boundary |
| :--- | :--- | ---: | ---: |
| Level 1 | Sign 1 | $250 €$ | $2500 €$ |
| Level 2 | Sign 1 - Sign 2 | $2500 €$ | $10000 €$ |
| Level 3 | Sign 1 - Sign 2 - Sign 3 | $10000 €$ | - |

> Testing of SoD:
> Sign $1-$ Sign 2
> Sign $2-$ Sign 3

| Approval | Number of PO's underneath <br> the lower boundary | Number of PO's between <br> the boundaries | Number of PO's above the <br> upper boundary |
| :--- | :---: | :---: | :---: |
| Level 1 | 25 | 1430 | 42 |
| Level 2 | 7 | 277 | 6 |
| Level 3 | 1 | 62 | - |
| Total | 33 | $\mathbf{1 7 6 9}$ | 48 |

## Violations of segregation of duties

|  | Activities tested for distinct executors | Number of PO's |
| :---: | :---: | :---: |
| Cases with 2 signatures | Sign 1 - Sign 2 | 280 |
|  | Create PO - Sign 1 - Sign 2 | 109 |
|  | Create PO - Sign 1 - Sign 2 <br> - Goods Receipt | 99 |
| Cases with 1 signature | Create PO - Sign 1 - Goods Receipt | 683 |
| Cases without approval | Create PO - Goods Receipt | 3081 |
| Total PO amount with violations of Segregation of Duty |  | ... $€$ |

## Testing other internal controls

Declarative language is very interesting for an auditor!

Social Network of people involved in release strategy


## Step 5 - Audit discussion



## Step 6 - Process Mining²



|  | Activities tested for distinct <br> executors |  |
| :--- | :--- | :--- |
| Cases with 2 signatures | Sign 1 - Sign 2 <br> Create PO - Sign 1 - Sign 2 <br> PO's |  |
|  | Sign 2 | Create PO - Sign 1 - <br> - Goods Receipt |
| Cases with 1 signature | Create PO - Sign 1 - Goods Receipt | 109 |
| Cases without approval | Create PO - Goods Receipt | 99 |
| Total PO amount with violations of Segregation of Duty | 683 |  |

## Step 7 - Reporting

Process mining report will be integrated in audit report.

## Deloitte.

Thank you

