

Incident Management System

Overview

The dataset is an event log for that describes the process of how an incident within the **ServiceNow Solution for Incident Management System**¹ is reported, processed and managed within an IT company. The data is collected from an audit system for one instance of the ServiceNow platform for Year 2016.

When an incident happens, the IT company needs to correct failures as soon as possible to minimize the impact on normal business operation².

The business objective is to help the IT company reduce the completion time for incident resolution (Ticket Completion Time). The analytic method investigates into the repetitive incident categories, resolution steps, and task overload during the processes.

Analyze the dataset

The original dataset includes 141.712 events for 24.918 incidents, described by 36 attributes (for each attribute information, see Appendix 1).

- I. An incident management process mapping exercise is done to organize attributes into four categories, following the chronological flow of the process. The four process categories were: (1) customer reports incident, (2) information related to the system, (3) processing the incident and (4) close the incident.

Incident Management Process Mapping

1. *Customer reports the incident*
 - a. OPEN [9], [10]
 - b. Each EVENT is recorded with the same INCIDENT NUMBER [1] along with Attributes [2] to [8].
 - i. INCIDENT STATUS [2], [3]
2. *Incident information enters (registered into) the management system*
 - a. CREATE: Employee files the incident into the system [11], [12]
 - b. INCIDENT DESCRIPTION
 - i. Contact type, location, (sub)category, customer perception of service availability [15], [16], [17], [18] [19]
 - c. Measure URGENCY of the incident [21], [22], [23]
3. *Processing the incident*

¹ <https://www.servicenow.com/products/incident-management.html>

² Amaral C.A.L., Fantinato M., Reijers H.A., Peres S.M. (2019) Enhancing Completion Time Prediction Through Attribute Selection. In: Ziemba E. (eds) Information Technology for Management: Emerging Research and Applications. AITM 2018, ISM 2018. Lecture Notes in Business Information Processing, vol 346.

- a. Employee updates the incident in the system
 - i. UPDATE [13], [14]
 - ii. ASSIGN the task to group [24], and a responsible [25]
 - b. Identify the PROBLEM caused the incident [29], [30],[31],[32]
 - c. RESOLVE the incident [34], [35]
4. CLOSE the incident [33], [36]

II. With limited information on the IT company and its business context, we then extracted **key data facts** from the dataset to build an overview of the incident resolving capacity of this IT company in Year 2016.

a. **Incidents in Year 2016**

- The total number of incidents is **24,918**
- The total number of events is **141,712**
- **There is an average of 6 events per incident**

b. **Incident State**

- 8 levels controlling:

[2] INCIDENT STATE	#	[3] ACTIVE	#
New	247	TRUE	
Active			
Awaiting Problem			
Awaiting User Info			
Awaiting Vendor			
Awaiting Evidence	21	FALSE	24,918
Resolved			
Closed		FALSE	24,918

- All incidents registered in the system are closed.
- 5471 incidents went through “Awaiting User Info” state.
-

c. **Service Level Agreement (SLA) target**

- 15,803 out of total 24,918 incidents (63.4%) are **compliant with SLA** after the incident was **CLOSED**.

Detect potential data quality issues

- **Missing Values (Appendix 2)**

17.53% of the dataset values are missing, in other words, around 900000 cells in the dataset were void of information. The missing cells were mostly grouped in the same attributes; therefore, the missing values do not affect the overall quality of the dataset.

- **To remove:** [32] caused_by, [31] vendor, [30] rfc, [29] problem_id, [20] cmbd_ci.
There are 5 attributes that have over 98% of unknown information, accounting for 78.8% of all missing values. We decided to remove them from our final database.
- **To keep:** [11] sys_created_by, [12] sys_created_at, [19] u_symptom, [25] assigned_to, [24] assignment_group
Though these 5 attributes have a proportion of missing values ranging from 10% to 30%, the valuable information is critical to future data analysis. Missing values are treated as “unknown”.
- The remaining attributes with missing data contain less of 5% of missing values, with most of them missing less than 0.1%. Therefore, we classify the impact from these missing values on our database as negligible and treat missing values as “unknown”.

- **Error: Negative Values**

There is one attribute which has data with error. The attribute [2] incident_state contains 8 levels to describe an incident state, such as New, Active, Awaiting Evidence, Closed...). There are 5 rows with a value of “-100”. As the negative values happen for two different incidents, and there is no similar trait observed from these two incidents, we classify “-100” as the error. We replace each “-100” with a reasonable state level in accordance to the before and after events for each incident.

Detect duplicates

There are no duplicate rows found in our dataset.

Every row of an incident number describes a particular interaction or update in a corresponding process-aware information system, which is called event. Therefore, an incident number can have multiple events (rows), compiling the same information and updating values to different columns.

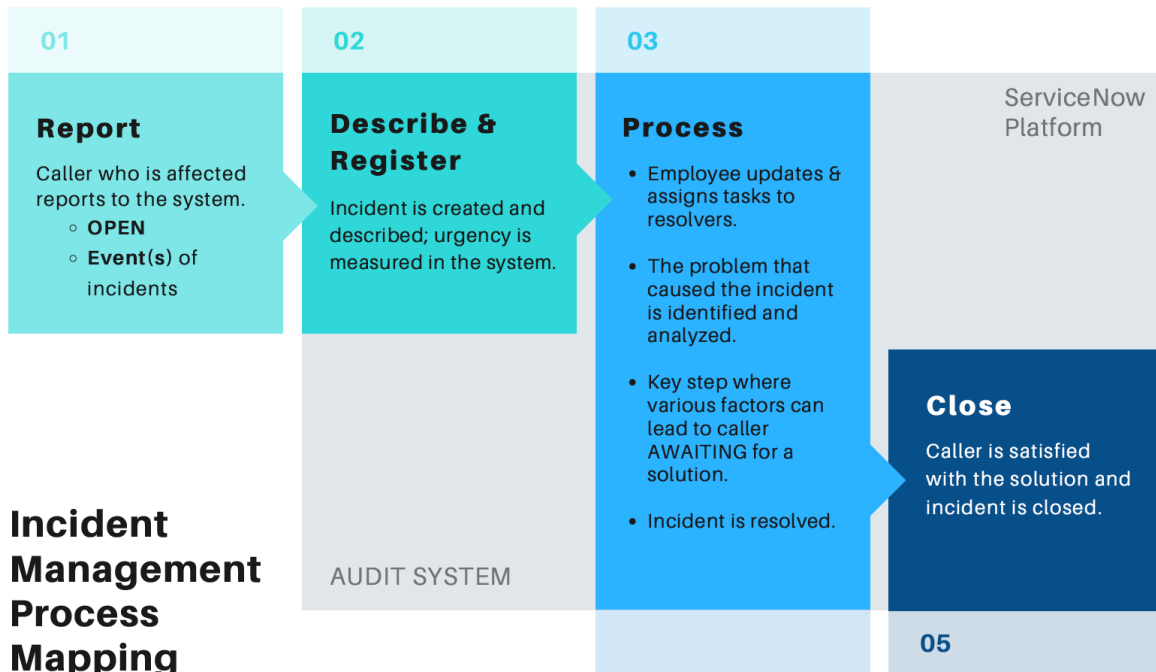
Data Warehouse Approach Selection

We select the **multidimensional data warehouse approach** for the incident management system, as it focuses on process and performance. A four-step dimensional process design is taken to build up our rationale.

Four-Step Dimensional Design Process

1) Select Business Process

The event log is a direct output metrics from the incident management process.



2) Specify the level of data details (Declare the *Grain*³)

The attributes in the event log contain most detailed and atomic information. They are categorized into three main groups according to information. The information categories were 1) People, 2) Time, and 3) Incident Description.

Several attributes that need to be moved to lower level of details are identified (1ST Normal Form), including:

- all EMPLOYEE attributes under **Category 01 PEOPLE**
 - EXAMPLE:
“Resolver 78” → “Resolve” (ACTION) + “78” (EMPLOYEE ID)
- all attributes under **Category 03 INCIDENT/ BUSINESS AFFECTED**
- GROUPASSIGNED under **Category 01 PEOPLE / EMPLOYEE**

³ Kimball, R. and Ross, M. (2013) The Data Warehouse Toolkit: The Definitive Guide to Dimensional Modeling (3rd Edition) Indiana: Wiley Publishing.

We further color-coded the attributes by **DYNAMIC** and **STATIC**.

- Dynamic attributes are variables/features that can be altered in a single case and represented in events. In the event log they document the changes of each action taken and are critical for the process analysis.
- Static attributes record one-time information that do not change nor get affected by actions taken in the process, such as identifiers of incident.

Descriptive Categories of Attributes

Incident Management System

BLUE Static Attribute RED Dynamic Attribute

01 Peoples	02 Time(s)	03 Incident (descriptive attributes)
Caller 8. User who reports the incident. Employee 9. Employees who OPEN 11. Employees who CREATE 13. Employees who UPDATE 24. Group ASSIGNED to Employee 25. Employees who is assigned to be RESPONSIBLE 34. Employees who RESOLVE	Time (Date) 10. OPEN time 12. CREATE time 14. UPDATE time 35. RESOLVE time 36. CLOSE time Time (Counts) 4. # of times ASSIGN TO changed 5. # of times incidents rejected by caller 6. # of times incident UPDATES	Basics of Incident 1. Incident identifier 2. Incident state 3. Active status Urgent Levels 21. impact 22. urgency 23. priority Business Affected 16. Location where affected 17. First-level service affected 18. Second-level service affected 19. User perception on service availability 20. Affected item
		What caused incident? 29. Problem categories 30. Request For Change identifier 31. Vendor in charge of the incident 32. Identify the RFC caused the incident How it is solved? 26. Knowledge based document 33. Identifier of resolution for the incident SLA Target 7. Measure whether incident exceeds Service Level Agreement Other 15. Incident reporting channels used 27. priority double-checked? 28. notification generated from incident

3) Identify the Dimensions

To answer “WHAT, WHERE, WHO, WHEN, WHY and HOW”, following steps are taken:

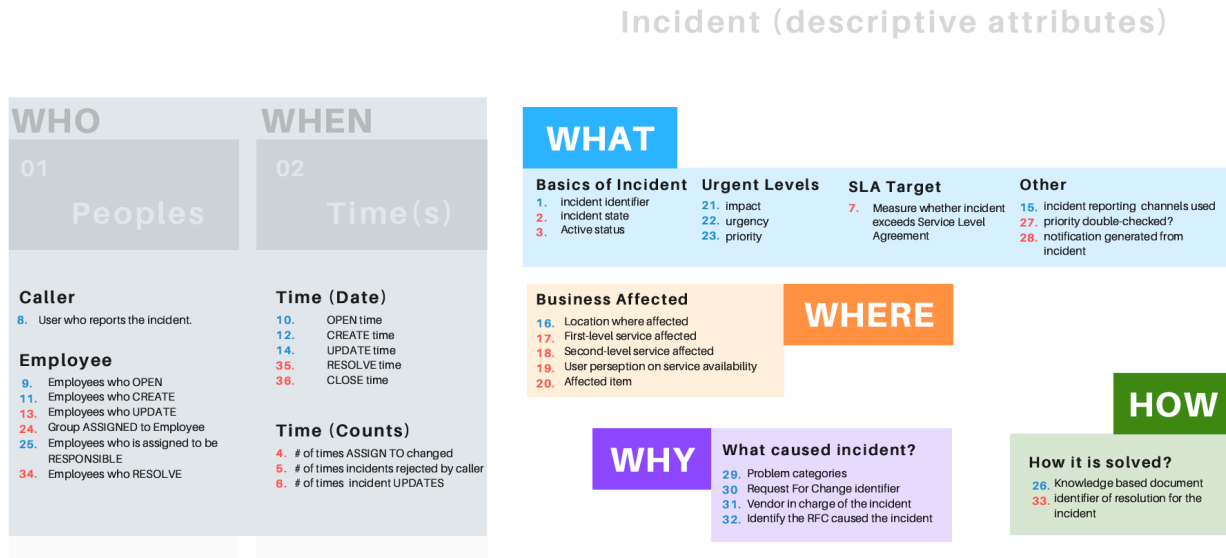
- **Category 01 PEOPLE** answers “WHO” and **Category 02 TIME** answers “WHEN”

WHAT, WHERE, WHY, HOW



WHO 01 Peoples	WHEN 02 Time(s)	03 Incident (descriptive attributes)
Caller 8. User who reports the incident. Employee 9. Employees who OPEN 11. Employees who CREATE 13. Employees who UPDATE 24. Group ASSIGNED to Employee 25. Employees who is assigned to be RESPONSIBLE 34. Employees who RESOLVE	Time (Date) 10. OPEN time 12. CREATE time 14. UPDATE time 35. RESOLVE time 36. CLOSE time Time (Counts) 4. # of times ASSIGN TO changed 5. # of times incidents rejected by caller 6. # of times incident UPDATES	Basics of Incident 1. Incident identifier 2. Incident state 3. Active status Urgent Levels 21. impact 22. urgency 23. priority Business Affected 16. Location where affected 17. First-level service affected 18. Second-level service affected 19. User perception on service availability 20. Affected item
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- **Category 03 INCIDENT DESCRIPTION** is broken down and reorganized to answer “WHAT, WHERE, WHY and HOW”



- Due to missing 98% percent of information for all attributes in **Category 03 INCIDENT DESCRIPTION/BUSINESS AFFECTED**, “WHERE” will not be answered in our model.

- **A multidimensional approach is identified:**

- People
- Date
- Incident
 - Description
 - Causes of Incident
 - Resolution

4) Identify the Facts

The incident management process measures how long it takes to resolve an incident. For the IT company, in order to minimize the negative impact to business, the main focus of this process is to reduce the completion time for incident resolution (Ticket Completion Time) as much as possible.

We identified **key business users’ requirements** as follows, in accordance to PART II. of dataset analysis on **key data facts**:

- Summary on events and incidents
- Incident State
- Service Level Agreement (SLA) target
- Ticket Completion Time
- Employee Task Assignment & Performance

Data Warehouse Design

1) Identify the entities based on multidimensional approach

a. Fact Tables & Dimension Tables

Fact Table	Static
Dimensions	Dynamic
Measures	

Incident Management		
Original Name	New Name	Original Variable #
	idIncident_Management (PK)	
	idIncident (FK)	
Assigned To	Responsible (FK)	25
	idStatus (FK)	
	idPriority (FK)	
Opened_by	Opened_by (FK)	9
Opened_at	Opened_at (FK)	10
Sys_Created_by	Created_by (FK)	11
Sys_Created_at	Created_at (FK)	12
Sys_Updated_by	Updated_by (FK)	13
Sys_Updated_at	Updated_at (FK)	14
Sys_Resolved_by	Resolved_by (FK)	34
Sys_Resolved_at	Resolved_at (FK)	35
Closed_at	Close_at (FK)	36
Close_Code	Close_Code	33
Made_SLA	SLA	7
Notify	Notify	28
Knowledge	Knowledge	26
U_Priority_Confirmation	Priority_Confirmation	27
U_Symptom	Customer_Symptom	19
Reassignment_Count	Reassignment_Count	4
Reopen_Count	Reopen_Count	5
Sys_Mod_Count	Modify_Count	6
Assignment_Group	Assigned_Group	24
Category	Category	17
Sub_Category	Sub_Category	18

Employee
New Name
idEmployee
idUser

Date
New Name
idDate
Date
Year
Month
Day
Day_of_Week
Week_Year

Incident		
Original Name	New Name	Original Variable #
	idIncident (PK)	
Number	Incident_Number	1
Location	Location	16
Caller ID	Customer_Number	8
Contact_Type	Contact_Type	15

Priority		
Original Name	New Name	Original Variable #
	idPriority	
Impact	Impact	21
Urgency	Urgency	22
Priority	Priority	23

Status		
Original Name	New Name	Original Variable #
	idStatus	
Active	Active	3
Incident State	Status_Description	2

c. Metrics

Overall metric for an effective incident resolution performance include:

- short ticket complete time
- less repetitive resolution steps
- fast identify the problem that caused the incident
- efficient and accurate assignment
- low attrition rate

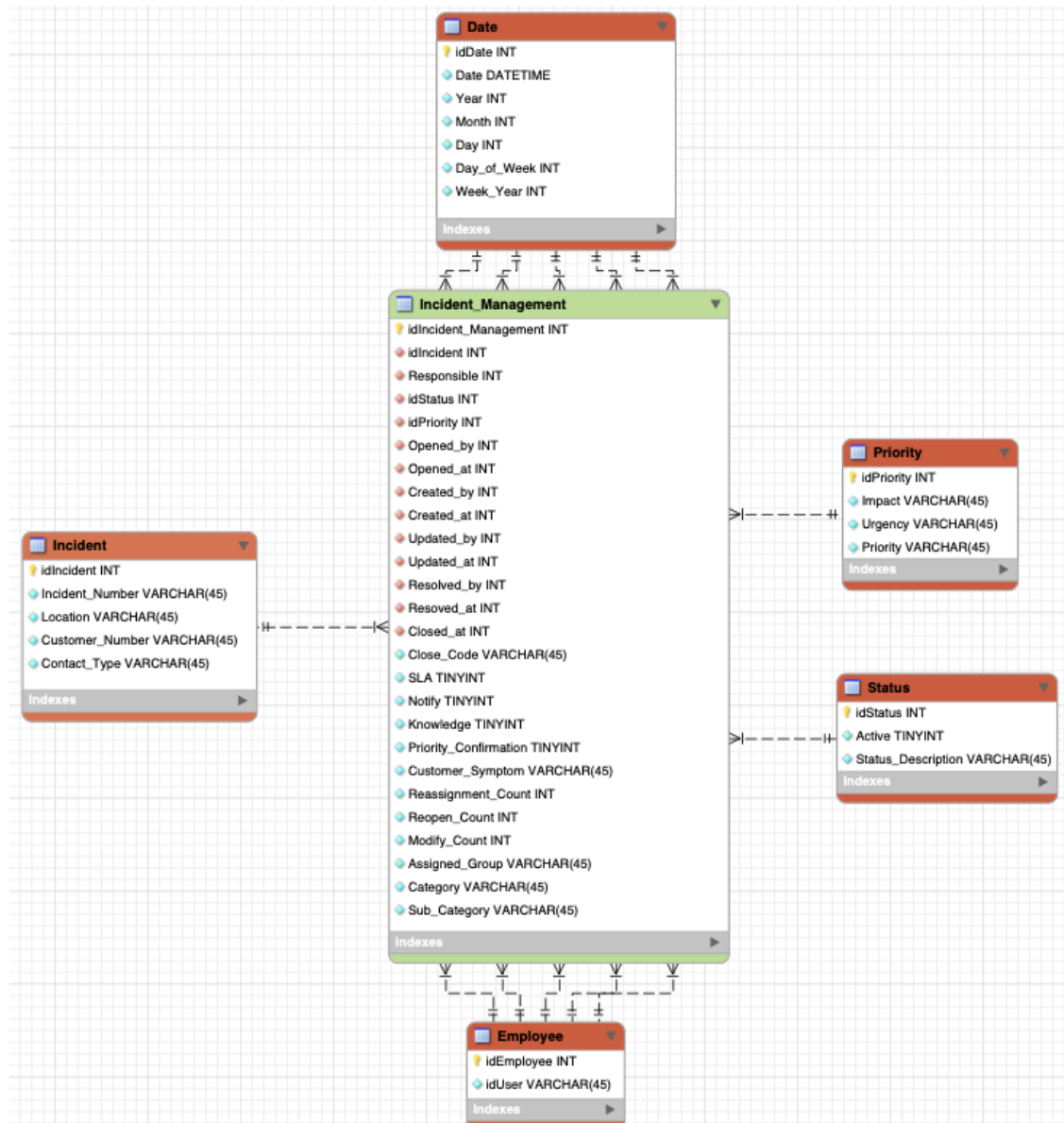
2) How we arrive at a Star Schema

Following the multidimensional approach, **dimension tables** such as **Employee Dimension**, **Date Dimension** and **Incident Dimension** are first defined. By understanding the unique values associated to the incidents, we further identify **Priority Dimension** and **Status Dimension**.

The **fact table** is designed to store all interactions that affect the incident in the time frame (from New to Close status). Various attributes at the needed granularity level are included in the fact table, ready to be aggregated to present key user's requirements.

The time ticket reduction is the **main business objective**, and the first dimension fits such n objective. Therefore, a **star schema** is achieved.

3) MYSQL Workbench Design (*IMS Star Schema Group E.mwb* attached)



Appendix 1. Attribute Information⁴

1. **number**: incident identifier (24,918 different values);
2. **incident state**: eight levels controlling the incident management process transitions from opening until closing the case;
3. **active**: boolean attribute that shows whether the record is active or closed/canceled;
4. **reassignment_count**: number of times the incident has the group or the support analysts changed;
5. **reopen_count**: number of times the incident resolution was rejected by the caller;
6. **sys_mod_count**: number of incident updates until that moment;
7. **made_sla**: boolean attribute that shows whether the incident exceeded the target SLA;
8. **caller_id**: identifier of the user affected;
9. **opened_by**: identifier of the user who reported the incident;
10. **opened_at**: incident user opening date and time;
11. **sys_created_by**: identifier of the user who registered the incident;
12. **sys_created_at**: incident system creation date and time;
13. **sys_updated_by**: identifier of the user who updated the incident and generated the current log record;
14. **sys_updated_at**: incident system update date and time;
15. **contact_type**: categorical attribute that shows by what means the incident was reported;
16. **location**: identifier of the location of the place affected;
17. **category**: first-level description of the affected service;
18. **subcategory**: second-level description of the affected service (related to the first level description, i.e., to category);
19. **u_symptom**: description of the user perception about service availability;
20. **cmdb_ci**: (confirmation item) identifier used to report the affected item (not mandatory);
21. **impact**: description of the impact caused by the incident (values: 1-“High; 2-Medium; 3-“Low);
22. **urgency**: description of the urgency informed by the user for the incident resolution (values: 1-“High; 2-“Medium; 3-“Low);
23. **priority**: calculated by the system based on 'impact' and 'urgency';
24. **assignment_group**: identifier of the support group in charge of the incident;
25. **assigned_to**: identifier of the user in charge of the incident;
26. **knowledge**: boolean attribute that shows whether a knowledge base document was used to resolve the incident;
27. **u_priority_confirmation**: boolean attribute that shows whether the priority field has been double-checked;
28. **notify**: categorical attribute that shows whether notifications were generated for the incident;
29. **problem_id**: identifier of the problem associated with the incident;
30. **rfc**: (request for change) identifier of the change request associated with the incident;
31. **vendor**: identifier of the vendor in charge of the incident;
32. **caused_by**: identifier of the RFC responsible by the incident;
33. **close_code**: identifier of the resolution of the incident;
34. **resolved_by**: identifier of the user who resolved the incident;
35. **resolved_at**: incident user resolution date and time (dependent variable);
36. **closed_at**: incident user close date and time (dependent variable).

⁴ Amaral C.A.L., Fantinato M., Reijers H.A., Peres S.M. (2019)

Appendix 2. Missing Values

Attribute Name	Nº Missing values	% versus total nº of values
caused_by	141469	99.83%
vendor	141468	99.83%
cmdb_ci	141267	99.69%
rfc	140721	99.30%
problem_id	139417	98.38%
sys_created_by	53076	37.45%
sys_created_at	53076	37.45%
u_symptom	32964	23.26%
assigned_to	27496	19.40%
assignment_group	14213	10.03%
opened_by	4835	3.41%
resolved_at	3141	2.21%
closed_code	714	0.50%
resolved_by	226	0.16%
subcategory	111	0.078%
category	78	0.055%
location	76	0.054%
caller_id	30	0.021%