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# Closing the Crevice

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*Achieving A Process For Asset  
Performance & Maintenance  
Analyses*



# Outline

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- Part I – Background
- Part II – Data Processing & Preparation Tool
- Part III – CBM Modeling in EXAKT
- Part IV – Conclusions

# Part I

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# Background

# Outline of Part I – Background

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- Hydro One Distribution System
  - Facts and Figures
- *EXAKT* Modeling/Decision Agent
  - Process and Value
- *EXAKT* Data Preparation Tool for Hydro One
  - OMDEC and BI-Cycle

Click for next

# Setup

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Hauler Truck



Conveyor Syncrude

Click for next

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# The Distribution Setting

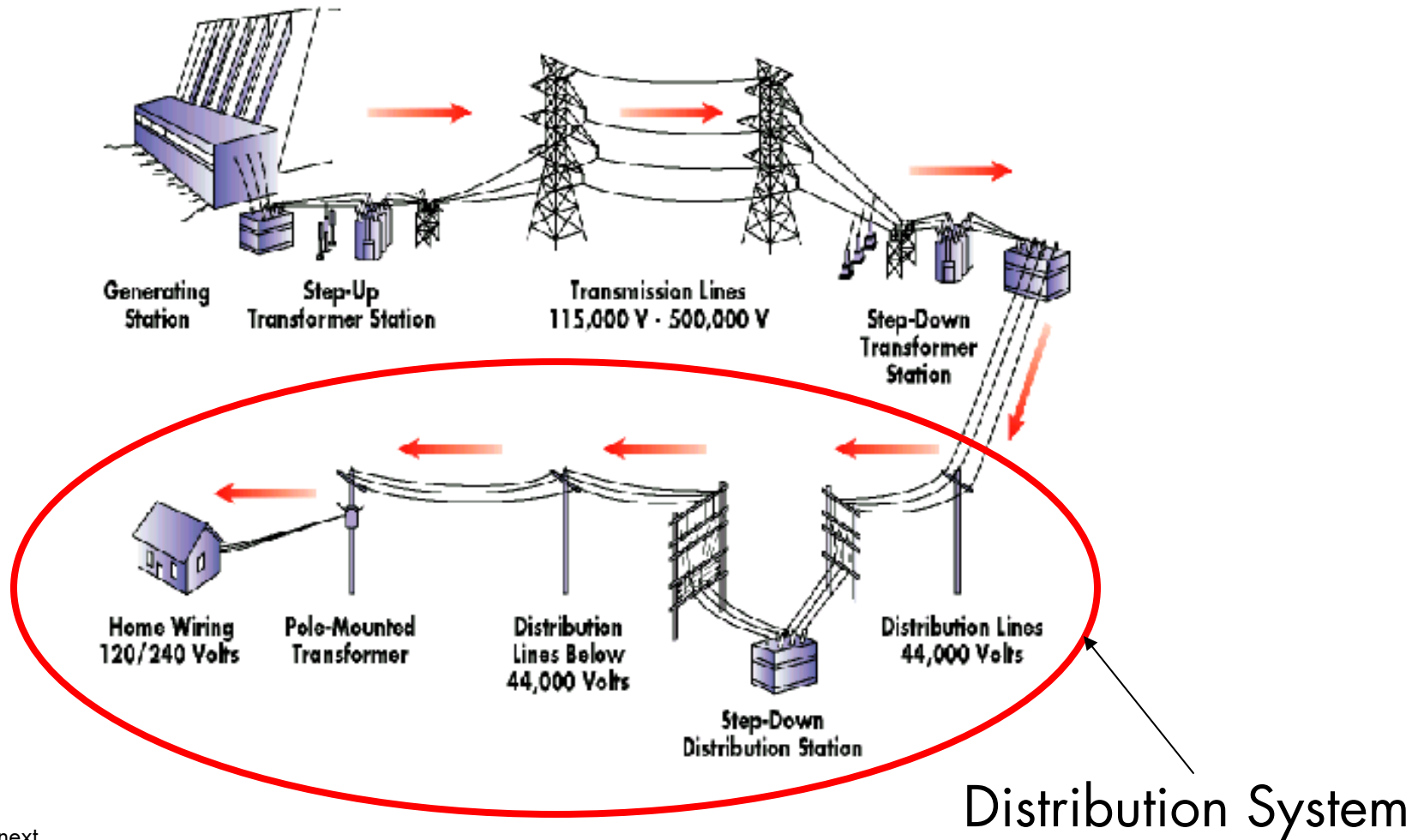
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- Electricity Flow:
  - produced in generating stations (GS) around the province
  - delivered to end-use customers on wires through the high voltage “grid” transmission system and lower voltage “radial” **distribution system**.
  - Distribution system includes 1000 distribution and regulating stations
- Voltage “stepped-down” at Transformer Stations (TS) and Distribution Stations (DS)
  - Distribution: step-down transformers on poles, underground, or on the ground before entering customer premises

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# The Distribution Setting

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# The Distribution Setting

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Distribution  
Stations (Dx)



Transformer  
Station (Tx)

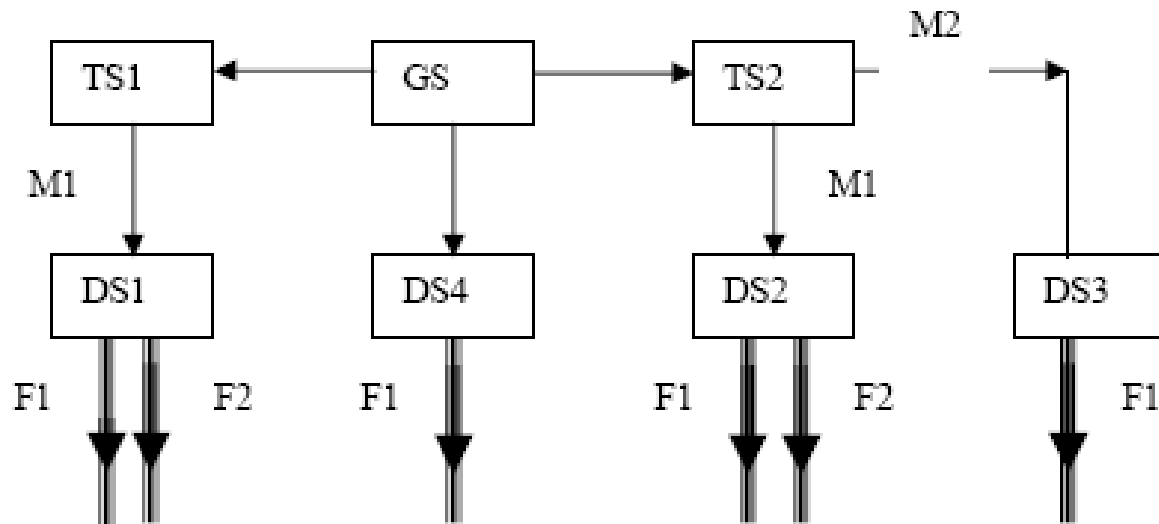


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# The Distribution Setting

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- Feeder - electrical circuit used to distribute electricity from the DS.
  - Typically 2-3 feeders (F1, F2, etc.) from each DS. Identified by station and feeder name (i.e. FEEDER DS F1)



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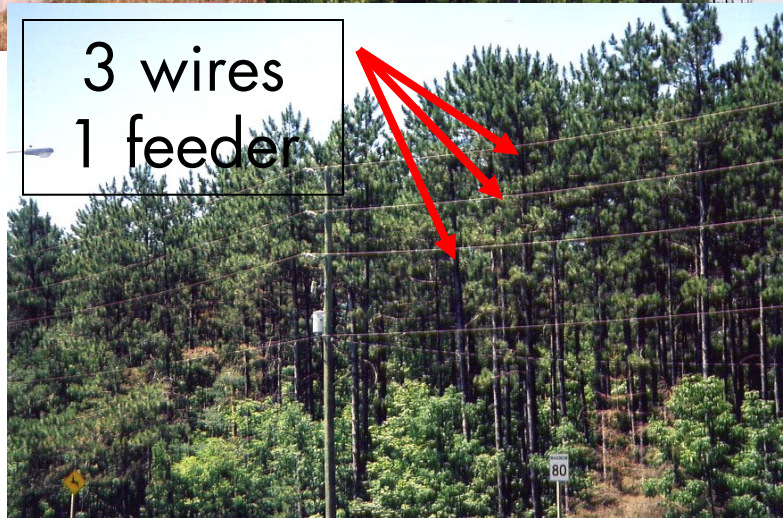
# The Distribution Setting

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## Distribution Circuits



3 wires  
1 feeder



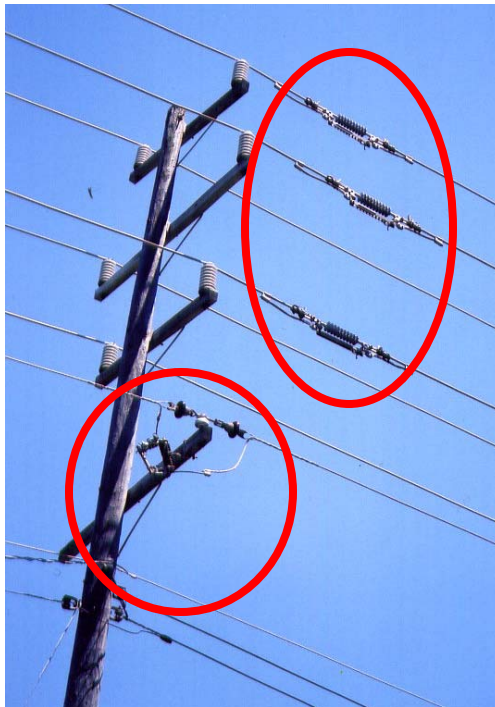
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# The Distribution Setting

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## Distribution Switches

- Numerous switches on each feeder. Switch will open when there is a problem on the electrical feeder (circuit)

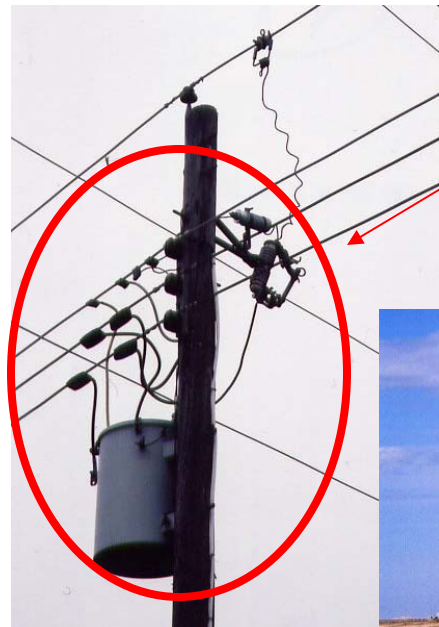


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# The Distribution Setting

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## Distribution Customer Transformers



**Open  
Wire Bus**

**Triplex**

**Private Primary**



Click for next



# The Distribution Setting

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Approx. 3000 Feeders



serving 1.2 million customers  
across Ontario

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# The Distribution Setting

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## Multiple Geographies

- Trees, rocks, water and swamp, open fields

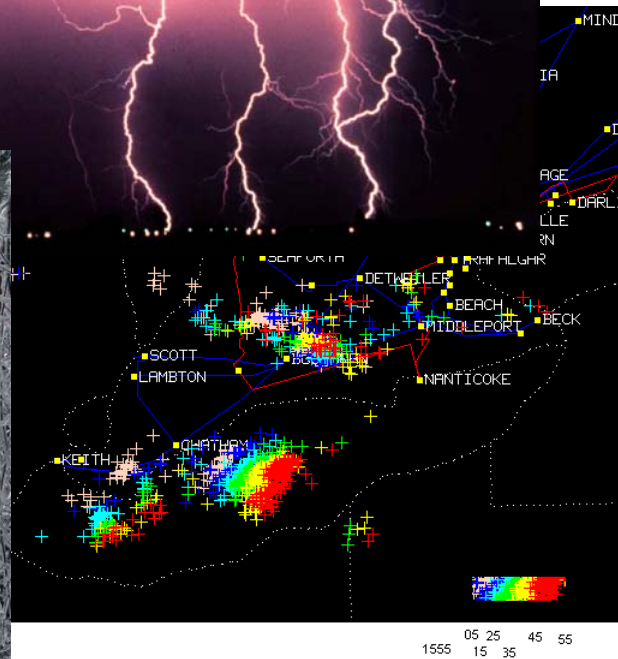
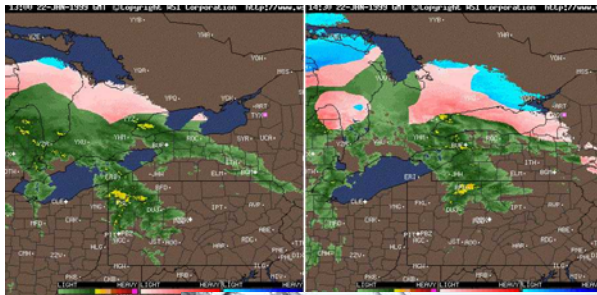


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# The Distribution Setting

## Multiple Weather Patterns



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# Distribution Data Collection

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- 53 Operating Centres in Hydro One's distribution system throughout the province of Ontario
- Multiple Stations within each operating centre, and each station has typically 2-3 feeders
- Data are collected or purchased for each Operating Centre or provincial area. Generally, there are 3 groups of data:
  - Outage, Environmental, and Asset data
- Data is analyzed to determine locations of concern

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# OEB Outage Cause Codes

Table 15.2 Cause of Service Interruption	
Code	Cause
0	<b>Unknown/Other</b> Customer interruptions with no apparent cause that contributed to the outage
1	<b>Scheduled Outage</b> Customer interruptions due to the disconnection at a selected time for the purpose of construction or preventive maintenance
2	<b>Loss of Supply</b> Customer interruptions due to problems in the bulk electricity supply system
3	<b>Tree Contacts</b> Customer interruptions caused by faults resulting from tree contact with energized circuits
4	<b>Lightning</b> Customer interruptions due to lightning striking the distribution system, resulting in an insulation breakdown and/or flash-overs
5	<b>Defective Equipment</b> Customer interruptions resulting from equipment failures due to deterioration from age, incorrect maintenance, or imminent failures detected by maintenance
6	<b>Adverse Weather</b> Customer interruptions resulting from rain, ice storms, snow, winds, extreme temperatures, freezing rain, frost, or other extreme weather conditions (exclusive of Code 3 and Code 4 events)
7	<b>Adverse Environment</b> Customer interruptions due to equipment being subject to abnormal environments, such as salt spray, industrial contamination, humidity, corrosion, vibration, fire, or flowing (previously Code 9)
8	<b>Human Element</b> Customer interruptions due to the interface of distributor staff with the system (previously Code 7)
9	<b>Foreign Interference</b> Customer interruptions beyond the control of the distributor, such as animals, vehicles, dig-ins, vandalism, sabotage, and foreign objects (previously Code 8)

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# EXAKT Modeling/Decision Agent

- Condition Based Management (CBM) software
- Measurement and analysis of the performance of Distribution Assets
  - Uses data to make timely maintenance decisions
  - Many companies use data from testing to find the significant “internal” variables
  - For Hydro One, the significant “external” variables are also contributors to the interruptions
- Two primary source database tables used by EXAKT
  - Events Table
  - Inspections Table



# Events & Inspections Table

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- Events Table – provides information on an item's "lifetime"
  - records date (time), cause, and device of interruption; each interruption categorized as either *failure* or *suspension*
- Inspections Table – contains weather data
  - (Wind Speed, Wind Direction, Air Pressure, Temperature, Lightning Strikes etc.)

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# EXAKT Modeling/Decision Agent Data Types

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- *EXAKT* uses interruption and environmental data directly in the statistical modeling process
- Interruption Data
  - Provides “lifetime” data on equipment operating in the distribution system
  - Information that is used to model equipment’s risk of failing in the future
- Environmental Data
  - Including wind, air pressure, temperature, lightning strikes

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# *EXAKT* Modeling/Decision Agent

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- Includes:
  - Weibull Module, Proportional Hazards Model (PHM), Sensitive of Optimal Policy

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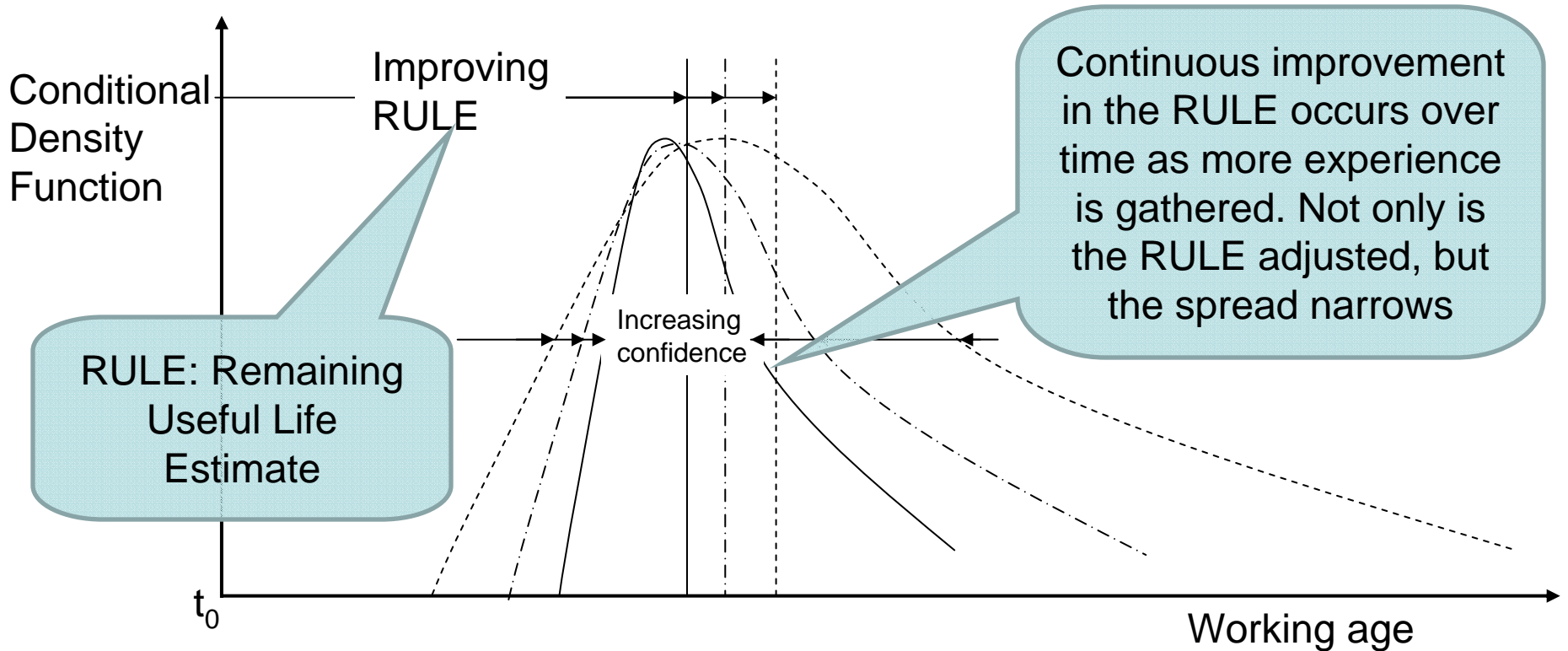
# *EXAKT* Modeling/Decision Agent

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- *EXAKT* provides a method for:
  - Measuring risk with these models to help optimize decisions on mitigating and avoiding interruptions in the future
  - continually refining the process to improve the accuracy of the model and the decisions that are made

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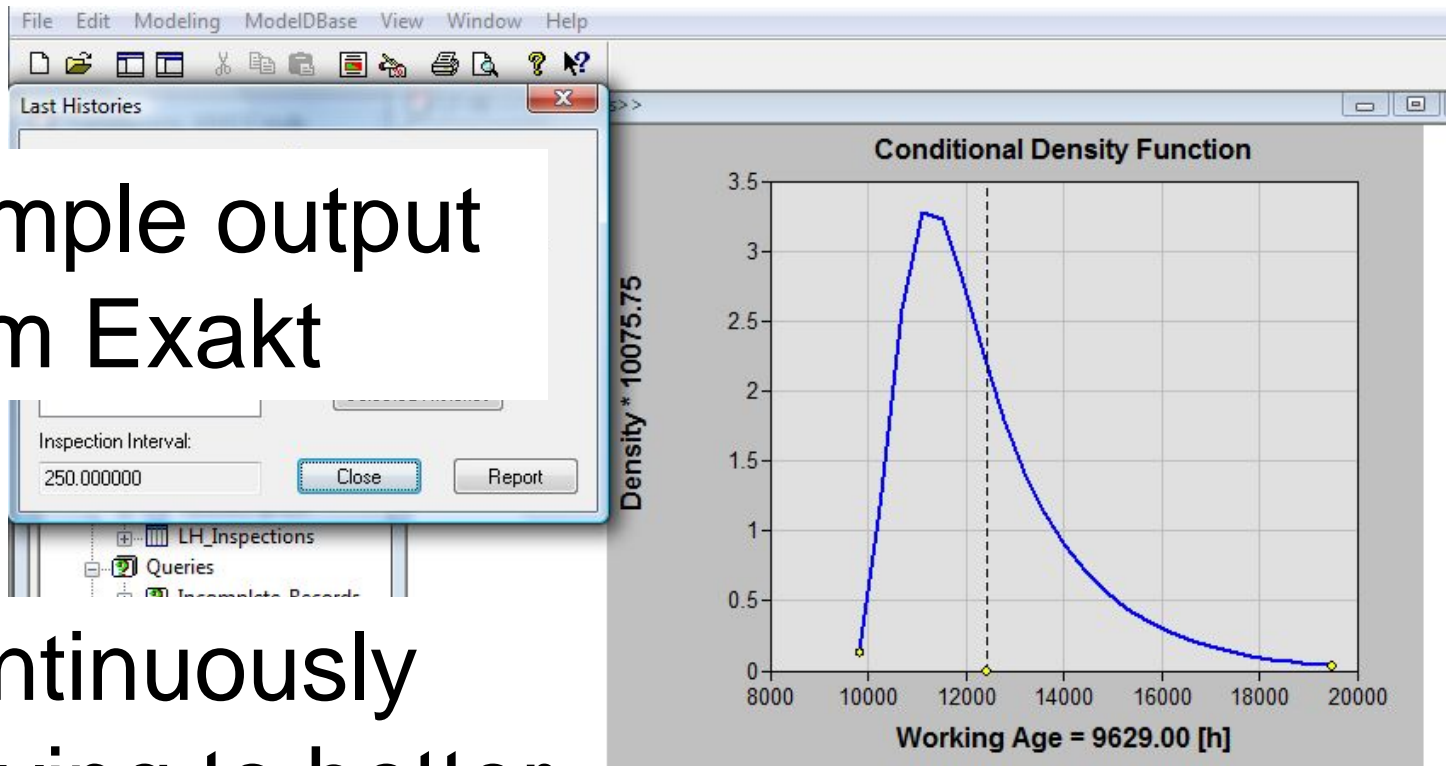
# EXAKT Refining the process



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# Conditional Density in *EXAKT*

Sample output from Exakt



Continuously moving to better confidence

Probability Intervals  
 RUL=2793.493002, StdDev=1785.727239

	Equal Tails Intervals		Mean-Centered Intervals (Mean = Working Age + ...)	
	Interval	Mean ± k*StdDev	Interval	
	[11158.54, 13213.59]	12422.49 ± 0.50*1785.73	[11529.63, 13315.36]	
60%	[11004.86, 13610.22]	12422.49 ± 0.75*1785.73	[11083.20, 13761.79]	
70%	[10841.03, 14117.86]	12422.49 ± 1.00*1785.73	[10636.77, 14208.22]	

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# *EXAKT* Preparation Tool

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- Currently, data received by Hydro One is not formatted or structured to easily perform statistical analysis for asset management using EXAKT
- *EXAKT* Preparation Tool for Hydro One
  - Supported by OMDEC and BI-Cycle
  - Facilitates data formation for compatibility with EXAKT software

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# Closing the Crevice

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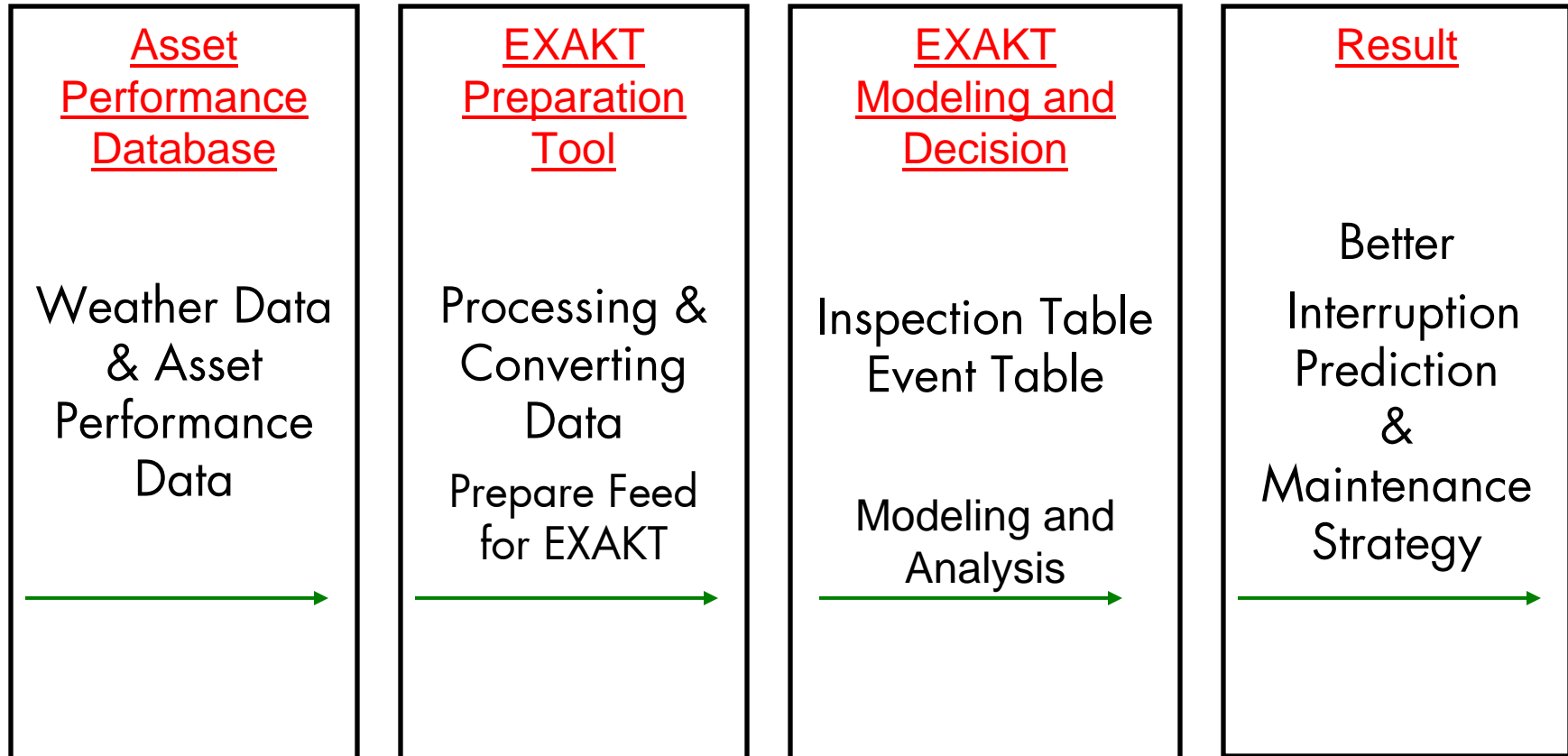
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# Closing the Crevice

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# Closing the Crevice

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# Part II

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# Data Processing & Preparation Tool

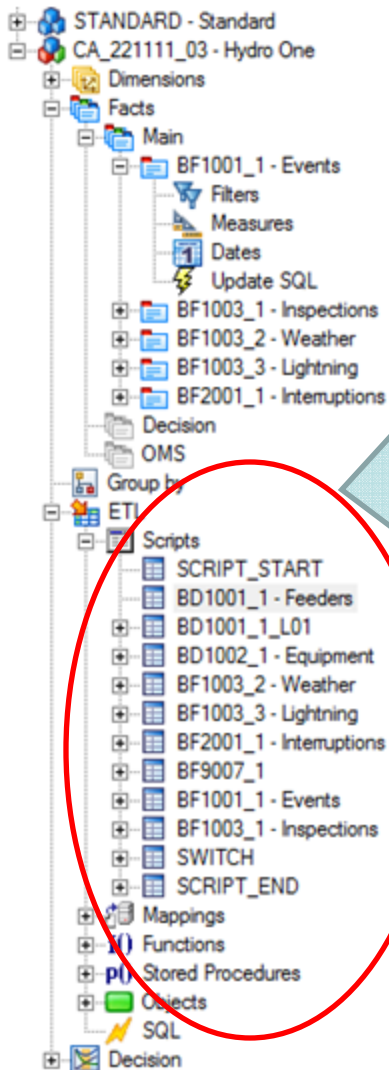
# Outline of Part II – Data Processing

The preparation of the data is needed to:

- Extract, Transform & Load the data
- tailor data – through various filters
- investigate data – looking for anomalies
- Generate the Events table
- Generation the Inspections table



# ETL SQLs



```
CREATE OR REPLACE VIEW BICAPP.CA_221111_03_V_BD1001_1
AS SELECT
upper(to_char(t."FEEDER_ID")) ID_BD1001_1,
t."FEEDER" BD1001_1,
t."OPERATION_CENTRE_NAME" ID_BL2001_1,
t."STATION" PARENT
t.FEEDER,
3 item_level,
upper(t."OPERATION_CENTRE_NAME") HLO1,
t."OPERATION_CENTRE_NAME" PARENT
t."OPERATION_CENTRE_NAME" ID_BD1001_1,
t."OPERATION_CENTRE_NAME" BD1001_1,
t."OPERATION_CENTRE_NAME" ID_BL2001_1,
SELECT DISTINCT
upper(t."OPERATION_CENTRE_NAME") ID_BD1001_1,
t."OPERATION_CENTRE_NAME" BD1001_1,
t."OPERATION_CENTRE_NAME" ID_BL2001_1,
```

“Extract, Transform, Load” or ETL. Is a data warehousing term which includes "Facts" and "Dimensions". A set of ETL scripts has been developed that will be permanently convert raw Hydro One data to a format for modeling and predictions.

# Raw Interruption Data

OPS_CENTE	STATION_NAME	FEEDER_NAME	SWITCH	TRANSFORMER	CEA_CAUSE	CEA_DESCRIPTION	INTERRUPTION_DATETIME	STRUCTUR_NO
					34	Major Storm	1/2/2000 12:40:00 PM	
					62	Equip. failure	1/2/2000 4:30:00 PM	
					60	Loss of BES	1/2/2000 9:00:00 PM	
					62	Equip. failure	1/3/2000 11:30:00 AM	
					62	Equip. failure	1/3/2000 2:24:00 PM	
					62	Equip. failure	1/4/2000 6:24:00 AM	
					62	Equip. failure	1/4/2000 5:25:00 PM	
					62	Equip. failure	1/10/2000 5:30:00 PM	
					62	Equip. failure	1/11/2000 3:30:00 PM	
					62	Equip. failure	1/12/2000 12:15:00 PM	
					52	Tree falling(weather)	1/16/2000 8:30:00 PM	
					63	Other-forced	1/18/2000 12:30:00 PM	
					63	Other-forced	1/19/2000 9:10:00 AM	
					63	Other-forced	1/19/2000 2:00:00 PM	
					51	Tree falling	1/21/2000 7:45:00 PM	
					56	Other-foreign inter.	1/21/2000 9:55:00 PM	
					52	Tree falling(weather)	1/22/2000 7:30:00 PM	
					62	Equip. failure	1/24/2000 2:24:00 PM	
					55	Cust. equipment	1/24/2000 4:18:00 PM	
					62	Equip. failure	1/25/2000 9:00:00 AM	
					62	Equip. failure	1/26/2000 9:00:00 AM	

Interruption data records when, where and what happened during an interruption, for the events table

# Raw Weather Data

OPS_CENTER	YEAR	MONTH	DAY	ELEMENT	ELEMENT_DESCRIPTION	T00	T01	T02	T03	T04	T05	T06	T07
	1999	1	1	78	Dry Bulb Temperature (deg C)	-19.8	-20.4	-19.1	-19	-19.1	-19.1	-19.1	-19.9
	1999	1	1	156	Wind Direction	NE	NE	NNE	NNW	NW	NNW	NW	NNW
	1999	1	1	73	Sea Level Pressure (kilopascals)	1013.3	1013	1013.3	1014.4	1014.7	1015.5	1016.8	1018.5
	1999	1	1	76	Wind Speed (km/h)	7	2	6	11	9	15	15	26
	1999	1	1	91	Snow	Light Snow	0	Light Snow	Light Snow	Light Snow	Light Snow	Light Snow	0
	1999	1	1	75	Dry Bulb Temperature (deg C)	-25.9	-25.9	-25.9	-25.9	-25.9	-25.9	-25.9	-25.9
	1999	1	1	156	Wind Direction	SW	SW	SW	SW	SW	SW	SW	SW
	1999	1	2	73	Sea Level Pressure (kilopascals)	1036.2	1036.7	1036.9	1037.2	1036.9	1035.8	1036.8	1036.8
	1999	1	2	76	Wind Speed (km/h)	4	4	4	4	4	0	4	6
	1999	1	3	78	Dry Bulb Temperature (deg C)	-16.8	-16.3	-15.3	-14.9	-15	-15.3	-14.7	-13.7
	1999	1	3	156	Wind Direction	ENE	ENE	E	E	ENE	E	ENE	E
	1999	1	3	73	Sea Level Pressure (kilopascals)	1025.4	1024.4	1021.3	1018.7	1017.7	1014.6	1012.9	1012.1
	1999	1	3	76	Wind Speed (km/h)	22	20	26	30	26	26	26	26
	1999	1	3	90	Freezing Drizzle	0	0	0	0	0	0	0	0
	1999	1	3	91	Snow	Light Snow	0	0	Moderate Snow	Heavy Snow	Light Snow	Heavy Snow	Heavy S
	1999	1	3	78	Dry Bulb Temperature (deg C)	-6.6	-6.9	-7.2	-8.3	-9.1	-9	-9.3	-9.7
	1999	1	4	156	Wind Direction	SW	SW	SW	WSW	SW	WSW	SW	SW
	1999	1	4	73	Sea Level Pressure (kilopascals)	1003.7	1003.9	1004.2	1004.8	1004.7	1004.6	1004.8	1005.4
	1999	1	4	76	Wind Speed (km/h)	15	17	19	15	19	20	17	20
	1999	1	5	78	Dry Bulb Temperature (deg C)	-18.4	-18.8	-19.3	-20.9	-21.1	-21.4	-22.1	-21.9
	1999	1	5	156	Wind Direction	NW	WNW	W	SW	SW	SW	WSW	SW
	1999	1	5	73	Sea Level Pressure (kilopascals)	1019.1	1019.6	1020.4	1021.1	1021.5	1021.7	1022.3	1023
	1999	1	5	76	Wind Speed (km/h)	13	11	7	7	6	6	6	4
	1999	1	5	91	Snow	0	0	0	0	0	0	0	0

Weather data records the hourly readings of 9 weather elements (for the inspections table):

- Sea level pressure
- Temperature
- Wind speed
- Wind direction
- Rain
- Freezing rain
- Freezing drizzle
- Thunderstorm
- Snow

# Raw Lightning Data

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S_DATE1	OPS_AREA
5/22/1999 8:00:00 PM	
6/2/1999 6:00:00 PM	
6/2/1999 6:00:00 PM	
6/2/1999 6:00:00 PM	
6/2/1999 6:00:00 PM	
6/2/1999 9:00:00 PM	
6/2/1999 6:00:00 PM	
6/2/1999 6:00:00 PM	
6/2/1999 6:00:00 PM	
6/2/1999 6:00:00 PM	
6/6/1999 3:00:00 PM	
6/7/1999 4:00:00 PM	
6/7/1999 4:00:00 PM	
6/7/1999 4:00:00 PM	
6/7/1999 4:00:00 PM	
6/7/1999 4:00:00 PM	
6/7/1999 3:00:00 PM	
6/7/1999 4:00:00 PM	
6/7/1999 3:00:00 PM	
6/20/1999 2:00:00 PM	
6/20/1999 2:00:00 PM	
6/20/1999 3:00:00 PM	
6/20/1999 3:00:00 PM	

Lightning data records the time and location of each strike for the inspection table

# Raw Data

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All from different programs and sources.

- Hydro Ones Outage Management and Asset Systems
- Environment Canada
- Ministry of Natural Resources

# Now What????

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We have the data

We have the tool

What does it do for us?

# Features for Data Processing & Analysis

Summary of Data of interest

Graphs for investigating and analyzing data

Display of events and inspections tables generated

The screenshot shows a software interface with three tabs: 'Summary', 'Standard Analysis', and 'Database Content'. The 'Summary' tab is active. On the left, there is a tree view with a 'Feeder' folder and a 'Filter' section containing 'Feeder', 'Equipment', 'Time', 'Weather', 'Lightning', and 'Interruptions'. The 'Filter Settings' table is as follows:

Filter Settings	
Connection	Oracle
Time Window	Jan 2006 - Dec 2008
Feeder	
Interruptions	Customer Count is less than or equal to 200

Below the filter settings is a 'Summary' table:

Weather	5,116	Feeder	46
Lightning	6,868	Equipment	10,769
Interruptions	3,925		

A link 'Copy to Work Area...' is located below the summary table.

Filters to tailor data as desired

Summary of the data set tailored

# Summary for One Geographic Area

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## Filter Settings

Connection	Oracle
Time Window	Jan 1999 - Dec 2008
Feeders	

## Summary

 Weather	<a href="#">14,991</a>	 Feeders	<a href="#">82</a>
 Lightning	<a href="#">7,990</a>	 Equipment	<a href="#">9,747</a>
 Interruptions	<a href="#">5,066</a>		

The 14,991 weather records represent 9 distinct weather elements. And each weather element is recorded hourly, 24 hours per day.

# Drill Down into data Details

## Filter Settings

Connection	Oracle
Time Window	Jan 1999 - Dec 2008
Feeders	

## Summary

Weather	<a href="#">14,991</a>	Feeders	<a href="#">82</a>
Lightning	<a href="#">7,990</a>	Equipment	<a href="#">9,747</a>
Interruptions	<a href="#">5,066</a>		

Equipment							
Row	Ex.	Operating Center	Equip. Id	Equip. type	Trans. low Voltage	Type description	Circuit
1	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
2	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
3	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
4	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
5	<input type="checkbox"/>				120/240 Volts	OVERHEADTRANSFORMEF	46184
6	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
7	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
8	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
9	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
10	<input type="checkbox"/>					UNDERGROUNDTRANSFOI	46184
11	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
12	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
13	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
14	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
15	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184
16	<input type="checkbox"/>					OVERHEADTRANSFORMEF	46184

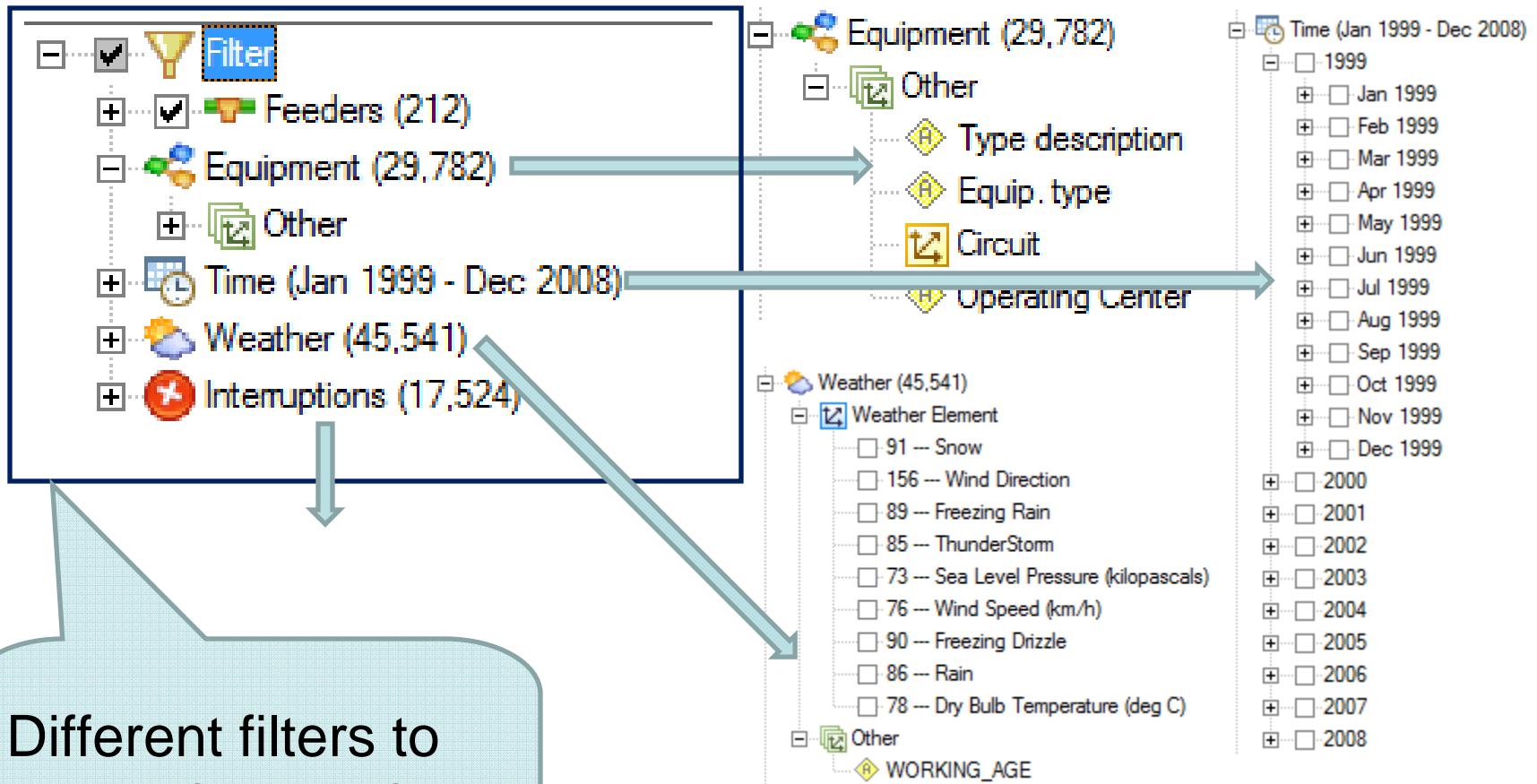
Other data details can also be drilled down from the links in the data summary

# Data Navigation



An Equipment tree enables easy and fast navigation of equipment based on Hydro One terminology

# Data Segregation



Different filters to conveniently tailor data as desired

# Preparation Tool – Relationships

- Possible weather conditions that will affect electricity distribution interruption
  - Pressure
  - Temperature
  - Wind speed
  - Wind direction
  - Rain
  - Freezing rain
  - Freezing drizzle
  - Thunderstorm
  - Snow
- Relations are showed in BI-Cycle Charts

# The Results

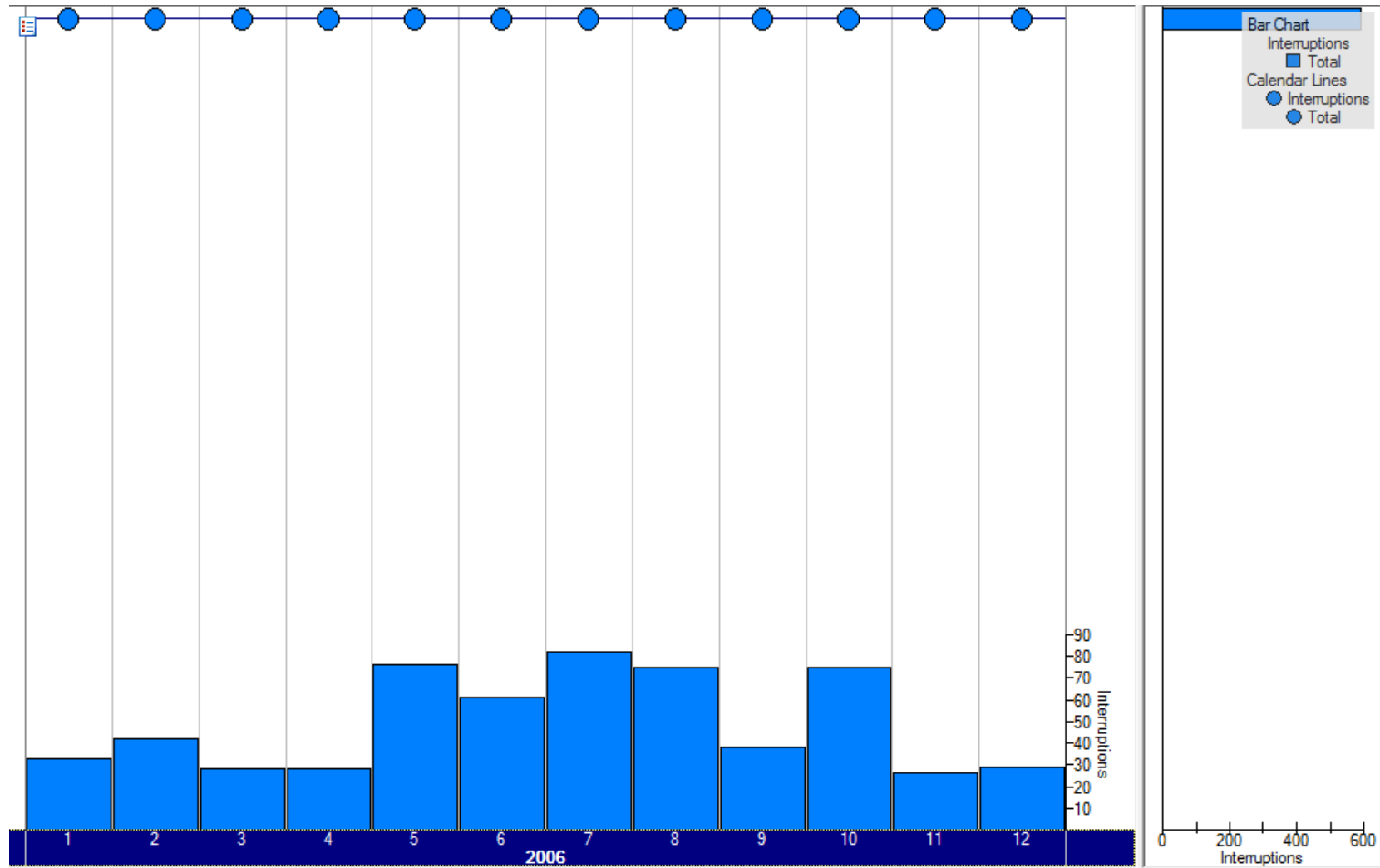
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We have the data  
We have the tool  
What does it do for us?

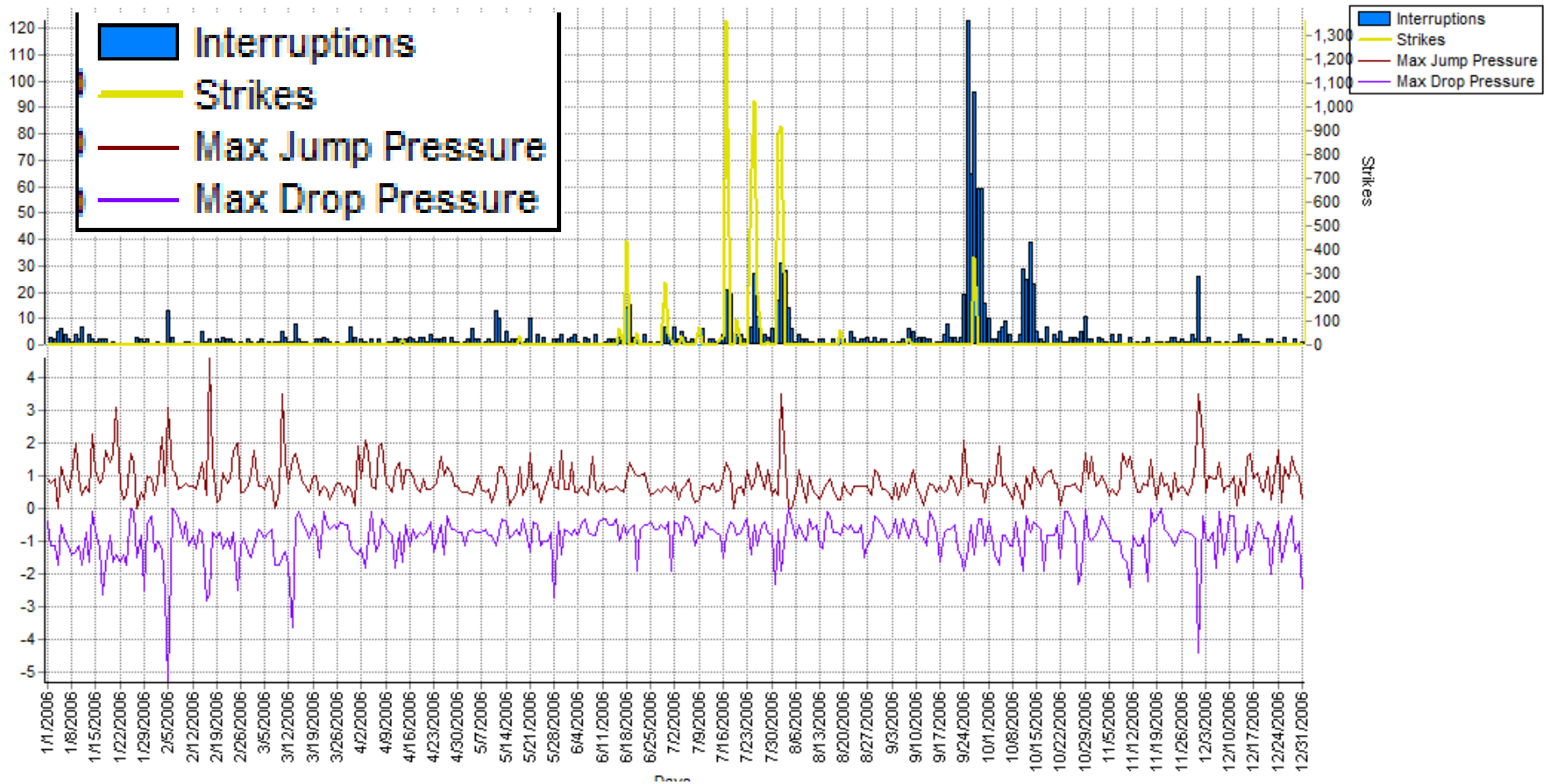
**Provides quick results**

# Interruptions Distribution

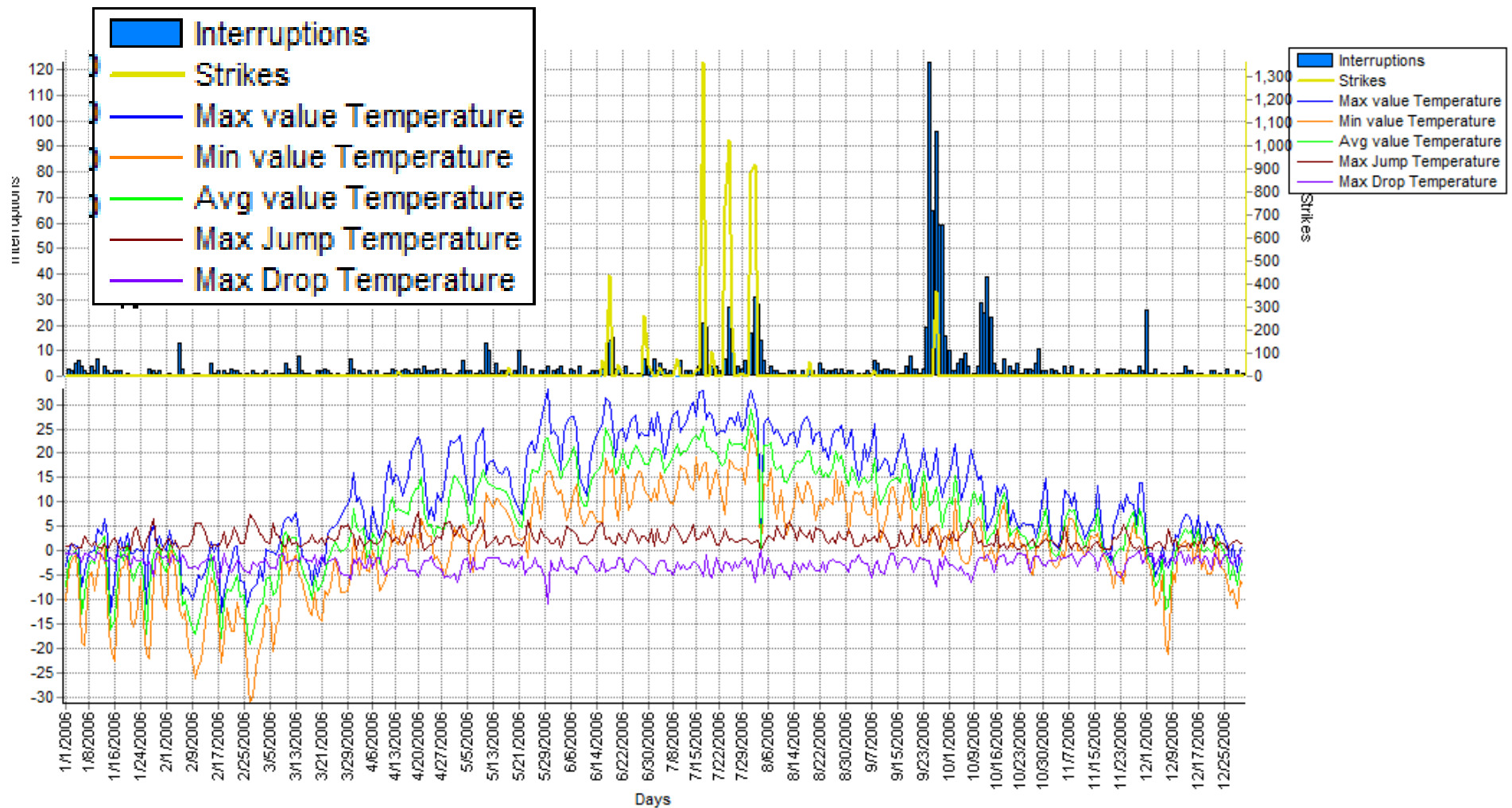
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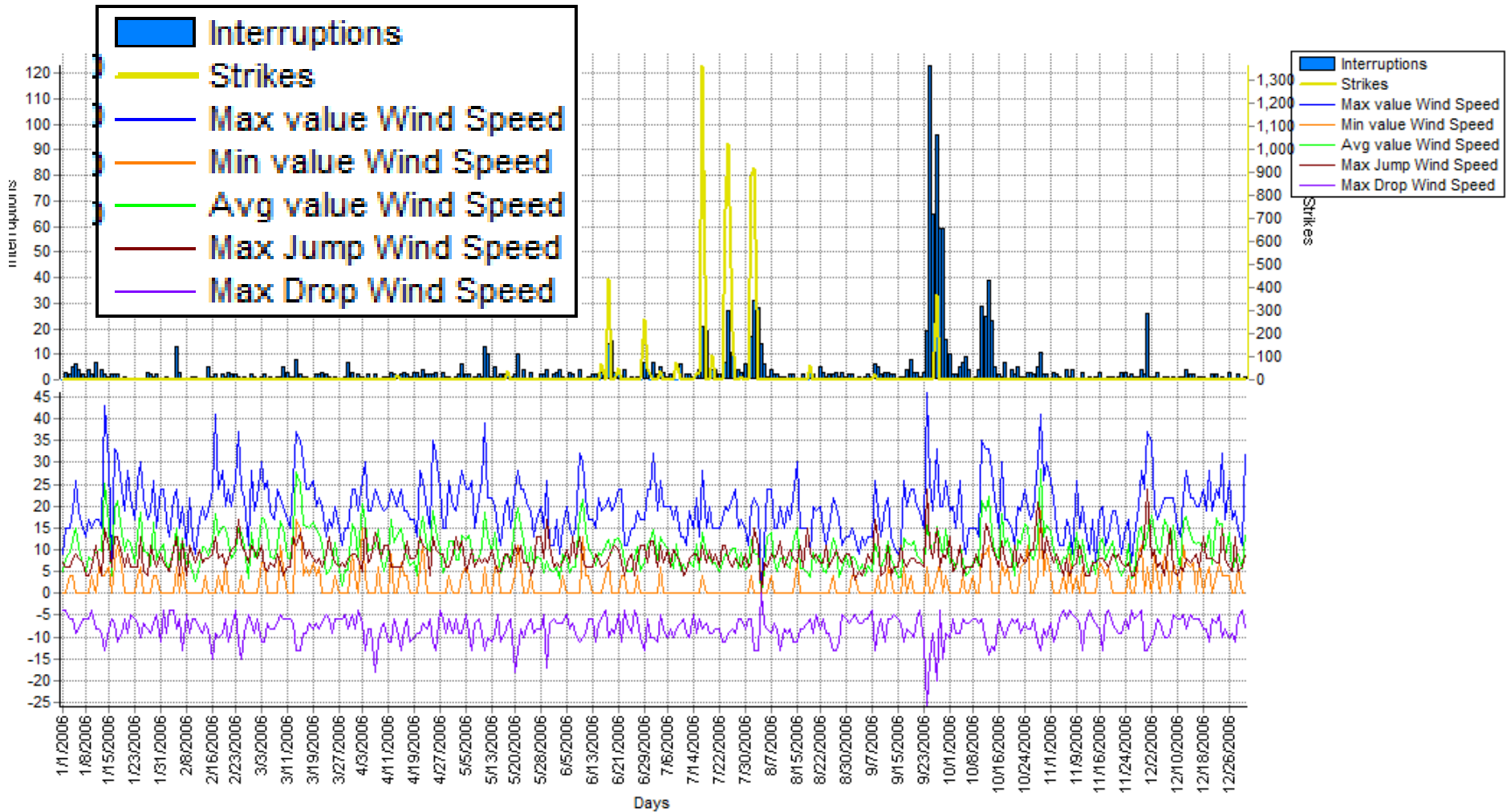
# Interruptions VS Daily Air Pressure & Lightning



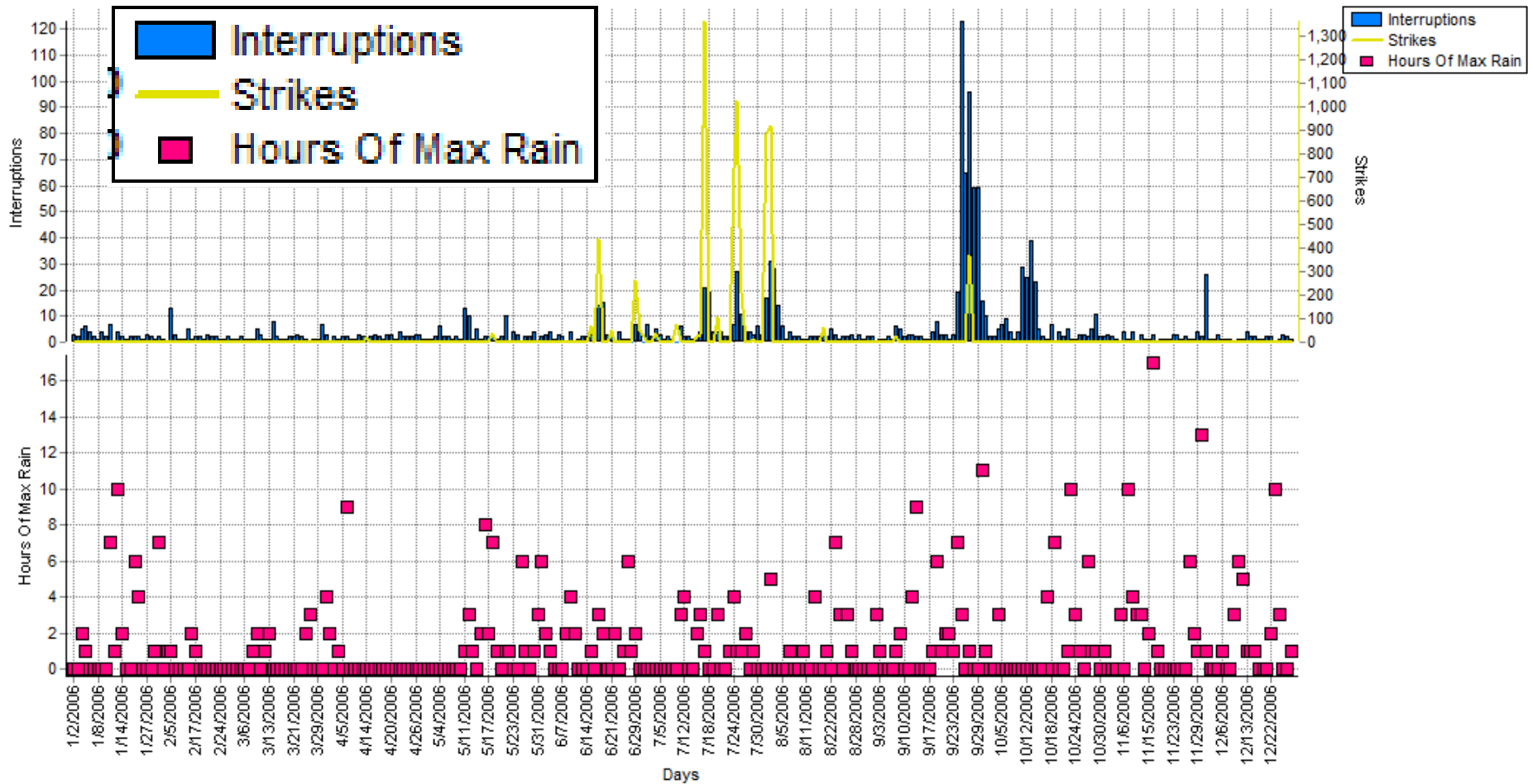
# Interruptions VS Daily Temperature & Lightning



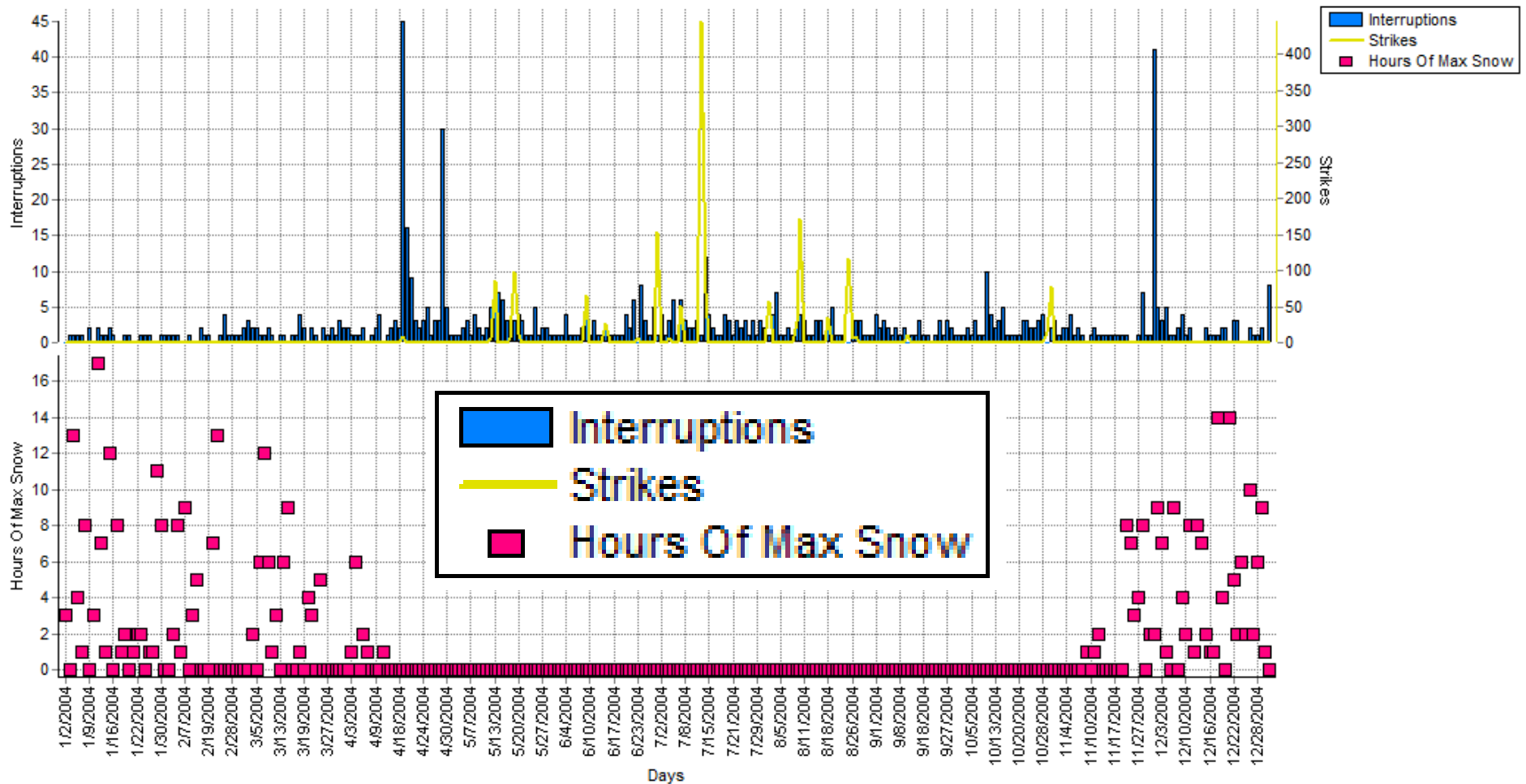
# Interruptions VS Daily Wind Speed & Lightning



# Interruptions VS Daily Rain & Lightning



# Interruptions VS Daily Snow & Lightning



# Assets linked to Weather data

Feeder						
Row	Ex.	Ops Center	Station	Feeder	Feeder Id	
1	<input type="checkbox"/>				*	
2	<input type="checkbox"/>				*	
3	<input type="checkbox"/>			F1		
4	<input type="checkbox"/>			F2		
5	<input type="checkbox"/>			F3		
6	<input type="checkbox"/>			F4		
7	<input type="checkbox"/>					
8	<input type="checkbox"/>			F1		
9	<input type="checkbox"/>					
10	<input type="checkbox"/>			F1		
11	<input type="checkbox"/>			F2		
12	<input type="checkbox"/>			F3		
13	<input type="checkbox"/>			F4		
14	<input type="checkbox"/>					
15	<input type="checkbox"/>			F1		
16	<input type="checkbox"/>			F3		

Feeder	
Ops Center	
Station	*
Feeder	
Feeder Id	*

Asset together with its associated weather data

Weather														
Row	Ex.	Ops Center	Weather Station	Element	Date	Element Descr.	Average	Max	Min	Max drop	Max jump	Hrs of Max	Hrs of Calm	Ni
1	<input type="checkbox"/>			SI	78	9/30/2006	Dry Bulb Temperature (deg C)	9.1	15.7	1.6	-1.3	3.2	1	
2	<input type="checkbox"/>			SI	78	10/1/2006	Dry Bulb Temperature (deg C)	11.2	14	9.2	-1.5	1.7	1	
3	<input type="checkbox"/>			SI	78	10/2/2006	Dry Bulb Temperature (deg C)	11.3	15.7	6.6	-1.8	1.7	1	
4	<input type="checkbox"/>			SI	78	10/3/2006	Dry Bulb Temperature (deg C)	13.3	17.3	8	-2.1	1.8	1	
5	<input type="checkbox"/>			SI	78	10/4/2006	Dry Bulb Temperature (deg C)	12.6	16.4	6.9	-4.7	1.7	1	
6	<input type="checkbox"/>			SI	78	10/5/2006	Dry Bulb Temperature (deg C)	6.4	10.3	2.5	-1.2	1.5	1	
7	<input type="checkbox"/>			SI	78	10/6/2006	Dry Bulb Temperature (deg C)	7.7	13.6	2.4	-3.1	2.7	1	

# Asset with Its Interruptions

The screenshot displays a software interface with two main data tables. The top table, titled 'Feeder', lists various feeders with columns for Row, Ex., Ops Center, Station, Feeder, and Feeder Id. The bottom table, titled 'Interruptions', lists specific outage events with columns for Row, Ex., Interrupt. No1, Interrupt. No2, Ops Center, Station, Feeder, Feeder Id, Structure No, Date, Outage cause, CEA description, and OE. A callout bubble points to the 'Feeder' table.

Row	Ex.	Ops Center	Station	Feeder	Feeder Id
1	<input type="checkbox"/>				*
2	<input type="checkbox"/>				*
3	<input type="checkbox"/>			F1	
4	<input checked="" type="checkbox"/>			F2	
5	<input type="checkbox"/>			F3	
6	<input type="checkbox"/>			F4	
7	<input type="checkbox"/>				
8	<input type="checkbox"/>			F1	
9	<input type="checkbox"/>				
10	<input type="checkbox"/>			F1	
11	<input type="checkbox"/>			F2	
12	<input type="checkbox"/>			F3	
13	<input type="checkbox"/>			F4	
14	<input type="checkbox"/>				
15	<input type="checkbox"/>			F1	
16	<input type="checkbox"/>			F3	

Row	Ex.	Interrupt. No1	Interrupt. No2	Ops Center	Station	Feeder	Feeder Id	Structure No	Date	Outage cause	CEA description	OE
1	<input type="checkbox"/>					F2			11/26/2006	Planned/scheduled	Maintenance	Sched
2	<input type="checkbox"/>					F2			10/29/2006	Tree Fallen	Tree falling	Tree C
3	<input type="checkbox"/>					F2			7/7/2006	Wildlife	Other-forced	Foreign

Asset together with its associated interruptions

# Interruption with Repair Notes

Row	Ex.	Interrupt. No1	Interrupt. No2	Ops Center	Station	Feeder	Feeder Id	Structure No	Date	0
8	<input type="checkbox"/>					F1			6/6/2006	Plann
9	<input type="checkbox"/>					F1			8/12/2006	Wildlif
10	<input type="checkbox"/>					F1			7/18/2006	Wildlif
11	<input checked="" type="checkbox"/>					F1			8/3/2006	Equip.
12	<input type="checkbox"/>					F1			2/14/2006	Equip.
13	<input type="checkbox"/>					F1			7/1/2006	Wildlif
14	<input type="checkbox"/>					F1			7/30/2006	Wildlif
15	<input type="checkbox"/>					F1			8/14/2006	Wildlif
16	<input type="checkbox"/>					F1			2/17/2006	Tree F
17	<input type="checkbox"/>					F1			4/1/2006	Equip.
18	<input type="checkbox"/>					F1			5/30/2006	Equip.
19	<input type="checkbox"/>					F1			9/8/2006	Equip.
20	<input type="checkbox"/>					F1			12/16/2006	Wildlif
21	<input type="checkbox"/>					F1			7/23/2006	Wildlif
22	<input type="checkbox"/>					F1			6/6/2006	Plann
23	<input type="checkbox"/>					F1			6/6/2006	Plann
24	<input type="checkbox"/>					F1			8/13/2006	Equip.

**Interruptions**

Interrupt. No:

Interrupt. No:

Ops Center

Station

Feeder F1

Feeder Id

Structure No

Date 8/3/2006

Outage cause Equip./ Mater

CEA descripti Equip. failure

OEB Group Defective Equ

Voltage

Switch

Transformer

Customer Cot 2

Number of Cu 1,165,724

Switch Enviro #

CEA Cause 62

OEB Code

Interruption together with its repair notes

REPAIR\_DESC: REPLACE SWITCH  
REPAIR\_REMARK: REPLACED 100 AMP FUSE

# The Crevice is Closed!

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Click for next

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# Event Data Is Ready

		Events						
	Row	Ex.	Feeder	Date ▲	Age	Ident	Event Cause	Event OEB
▶	1	<input type="checkbox"/>	46209	1/2/2000	366	ARN03370	E62	E5
	2	<input type="checkbox"/>	46209	1/2/2000	366	ARN03370	B62	B5
	3	<input type="checkbox"/>	46198	1/2/2000	366	ARN00075	B34	B6
	4	<input type="checkbox"/>	46198	1/2/2000	366	ARN00075	E34	E6
	5	<input type="checkbox"/>	46212	1/3/2000	367	ARN09984	B62	B5
	6	<input type="checkbox"/>	46225	1/3/2000	367	ARN04574	B62	B5
	7	<input type="checkbox"/>	46212	1/3/2000	367	ARN09984	E62	E5
	8	<input type="checkbox"/>	46225	1/3/2000	367	ARN04574	E62	E5
	9	<input type="checkbox"/>	46225	1/4/2000	368	ARN05431	B62	B5
	10	<input type="checkbox"/>	46329	1/4/2000	368	ARN09268	E62	E5
	11	<input type="checkbox"/>	46225	1/4/2000	368	ARN05431	E62	E5
	12	<input type="checkbox"/>	46329	1/4/2000	368	ARN09268	B62	B5
	13	<input type="checkbox"/>	46204	1/10/2000	374	ARN05732	E62	E5
	14	<input type="checkbox"/>	46204	1/10/2000	374	ARN05732	B62	B5
	15	<input type="checkbox"/>	46200	1/11/2000	375	ARN03386	B62	B5
	16	<input type="checkbox"/>	46200	1/11/2000	375	ARN03386	E62	E5
	17	<input type="checkbox"/>	46204	1/12/2000	376	ARN04101	E62	E5
	18	<input type="checkbox"/>	46204	1/12/2000	376	ARN04101	B62	B5
	19	<input type="checkbox"/>	46198	1/16/2000	380	ARN01222	E52	E3
	20	<input type="checkbox"/>	46198	1/16/2000	380	ARN01222	B52	B3
	21	<input type="checkbox"/>	46209	1/18/2000	382	ARN02415	E63	E5
	22	<input type="checkbox"/>	46209	1/18/2000	382	ARN02415	B63	B5
	23	<input type="checkbox"/>	46192	1/19/2000	383	ARN06180	E63	E5
	24	<input type="checkbox"/>	46192	1/19/2000	383	ARN06180	B63	B5
	25	<input type="checkbox"/>	46200	1/19/2000	383	ARN04741	B63	B5
	26	<input type="checkbox"/>	46200	1/19/2000	383	ARN04741	E63	E5
	27	<input type="checkbox"/>	46197	1/21/2000	385	ARN78	E56	E8
	28	<input type="checkbox"/>	46197	1/21/2000	385	ARN78	B56	B8
	29	<input type="checkbox"/>	46197	1/22/2000	386	ARN78	E52	E3

# Inspection Data is Ready

		Measurements				Sea Level Pressure (kilopascals)					Wind Sp		
Row	Ex.	Operating Center	Ident	Date	Age	Average	Max	Min	Max Jump	Max Drop	Average	Max	Min
1	<input type="checkbox"/>	OPS 12	ARN04873	1/4/2006	2560	1,013.1	1,020.1	1,004.2	0.0	-2.1	11.6	17.0	4.0
2	<input type="checkbox"/>	OPS 12	ARN04873	1/17/2006	2573	1,018.4	1,023.1	1,009.4	1.0	-1.8	18.7	33.0	4.0
3	<input type="checkbox"/>	OPS 12	ARN04873	4/7/2006	2653	1,004.6	1,008.0	1,000.9	2.0	-1.2	11.9	30.0	0.0
4	<input type="checkbox"/>	OPS 12	ARN04873	1/14/2006	2570	999.4	1,009.3	992.7	2.5	-1.3	28.2	44.0	7.0
5	<input type="checkbox"/>	OPS 12	ARN04873	4/24/2006	2670	1,008.1	1,010.3	1,006.6	0.6	-0.9	13.4	22.0	7.0
6	<input type="checkbox"/>	OPS 12	ARN04873	8/24/2006	2792	1,017.1	1,018.2	1,016.2	0.9	-0.5	6.4	19.0	0.0
7	<input type="checkbox"/>	OPS 12	ARN04873	12/23/2006	2913	1,006.8	1,014.8	1,003.3	0.3	-1.6	13.6	32.0	0.0
8	<input type="checkbox"/>	OPS 12	ARN04873	9/24/2006	2823	998.7	1,006.6	992.4	2.0	-1.7	24.2	50.0	6.0
9	<input type="checkbox"/>	OPS 12	ARN04873	3/13/2006	2628	1,006.7	1,015.5	994.0	0.4	-3.1	15.1	32.0	0.0
10	<input type="checkbox"/>	OPS 12	ARN04873	11/7/2006	2867	1,018.8	1,022.7	1,015.3	0.3	-1.1	9.3	17.0	4.0
11	<input type="checkbox"/>	OPS 12	ARN04873	12/30/2006	2920	1,032.1	1,038.2	1,028.8	0.7	-1.4	9.5	15.0	4.0
12	<input type="checkbox"/>	OPS 12	ARN04873	11/26/2006	2886	1,023.1	1,025.1	1,021.1	1.1	-0.5	7.5	13.0	4.0
13	<input type="checkbox"/>	OPS 12	ARN04873	10/20/2006	2849	1,005.0	1,007.8	1,002.4	0.8	-1.3	15.4	24.0	0.0
14	<input type="checkbox"/>	OPS 12	ARN04873	11/15/2006	2875	1,014.6	1,016.6	1,011.4	0.6	-0.4	6.5	13.0	0.0
15	<input type="checkbox"/>	OPS 12	ARN04873	11/2/2006	2862	1,015.0	1,016.4	1,013.6	0.8	-0.5	11.0	20.0	4.0
16	<input type="checkbox"/>	OPS 12	ARN04873	12/16/2006	2906	1,015.8	1,020.5	1,005.7	2.0	-0.9	13.3	22.0	0.0
17	<input type="checkbox"/>	OPS 12	ARN04873	12/14/2006	2904	1,009.3	1,011.7	1,004.7	0.3	-1.5	10.7	17.0	4.0
18	<input type="checkbox"/>	OPS 12	ARN04873	9/10/2006	2809	1,026.7	1,029.7	1,022.9	1.0	-0.3	11.9	17.0	6.0
19	<input type="checkbox"/>	OPS 12	ARN04873	9/5/2006	2804	1,016.7	1,019.0	1,013.9	0.5	-1.0	6.3	9.0	4.0
20	<input type="checkbox"/>	OPS 12	ARN04873	9/3/2006	2802	1,018.0	1,023.0	1,014.9	0.3	-0.9	16.5	26.0	4.0
21	<input type="checkbox"/>	OPS 12	ARN04873	5/10/2006	2686	1,013.0	1,014.7	1,011.0	0.3	-0.8	17.1	26.0	6.0
22	<input type="checkbox"/>	OPS 12	ARN04873	7/11/2006	2748	1,016.6	1,018.0	1,014.6	0.6	-0.2	7.3	15.0	4.0
23	<input type="checkbox"/>	OPS 12	ARN04873	8/6/2006	2774	1,020.1	1,023.2	1,013.6	0.7	-1.2	10.5	20.0	4.0
24	<input type="checkbox"/>	OPS 12	ARN04873	2/23/2006	2610	1,008.7	1,010.7	1,004.6	0.3	-0.8	6.8	22.0	0.0
25	<input type="checkbox"/>	OPS 12	ARN04873	2/4/2006	2591	1,008.9	1,014.5	995.5	1.1	-3.5	18.3	43.0	0.0
26	<input type="checkbox"/>	OPS 12	ARN04873	1/3/2006	2559	1,020.5	1,021.6	1,019.6	0.7	-1.0	15.2	26.0	7.0
27	<input type="checkbox"/>	OPS 12	ARN04873	1/25/2006	2581	1,002.8	1,014.0	996.5	1.5	-0.2	17.9	32.0	4.0
28	<input type="checkbox"/>	OPS 12	ARN04873	1/24/2006	2580	1,004.4	1,012.4	996.8	0.2	-2.1	12.8	22.0	6.0

Measurements	
Operatin	ARNPRIOR
Ident	ARN04873
Date	1/4/2006
Age	2560
Sea Level Pressure (kilopascals)	
Average	1,013.1
Max	1,020.1
Min	1,004.2
Max Jump	0.0
Max Drop	-2.1
Wind Speed (km/h)	
Average	11.6
Max	17.0
Min	4.0
Max Jump	7.0
Max Drop	-6.0
Dry Bulb Temperature (deg C)	
Average	-6.9
Max	9.6
Min	-9.4
Max Jump	18.9
Max Drop	-19.0
Thunderstorm	
Max	
Min	
Max Jump	
Hours of	
Rain	
Average	

# Part III

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## CBM Modeling in EXAKT

# Weather and Lightning Variables

ELEMENT	ELEMENT_DESCRIPTION	Max	Min	Avg	Max Jump	Max Drop	Hours Of Max
73	Sea Level Pressure (kilopascals)	√	√	√	√	√	
76	Wind Speed (km/h)	√	√		√	√	
78	Dry Bulb Temperature (deg C)	√	√	√	√	√	
85	ThunderStorm	√	√		√		√
86	Rain	√	√	√	√		√
89	Freezing Rain	√	√	√	√		√
90	Freezing Drizzle	√	√	√	√		√
91	Snow	√	√	√	√		√
156	Wind Direction						

Wind Direction	Hours
Calm	√
N	√
E	√
S	√
W	√
NE	√
NW	√
SE	√
SW	√

Lightning	Number of Strikes
Lightning Strike	√

Raw hourly weather and lightning data are summarized into daily (or weekly, or monthly) data consisting of 48 variables listed in these 3 tables, to reduce the huge amount of weather and lightning data for processing and modeling.

# Summary of Data for EXAKT Modeling

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## Basic Data Analysis

Number of Idents:	1059
Number of Histories:	1424
Number of beginnings (B):	1424
Number of failures (EF):	265
Number of suspensions (ES):	91
Number of temporary suspensions (*ES):	1068
Number of inspections (IN):	23439
Number of histories without inspections (IN)	37

## Basic Statistical Analysis

	Average	Std. Dev.
Inspection Interval	6.81	0.92
Inspections per History	16.46	11.00
History (Overall)	112.86	76.53
History (Failed)	75.69	69.67
History (Suspended)	69.65	59.08
History (Temp. Suspended)	125.76	75.09
History (Failed+Suspended)	74.15	67.18

(-) Not applied

# EXAKT Model

Number of lifecycles

Preventive renewals

Units presently operating

## Summary of Events and Censored Values

Sample Size	Failed	Censored (Def)	Censored (Temp)	% Censored
1415	265	91	1068	81.3

Age influence parameter

Variable is Significant – yes /no

Measure of scatter

Other statistical tests for assessing model applicability

## Summary of Estimated Parameters (based on ML method)

Parameter	Estimate	Sign. (*)	Standard Error	Wald	DF	p - Value	Exp of Estimate	95 % CI	
								Lower	Upper
Scale	2709	-	1032	-	-	-	-	687.7	4731
Shape	0.781	Y	0.04546	23.21	1	0	-	0.6919	0.8701
MaxWinSpeDrop	0.06944	Y	0.02	12.05	1	0.0005179	1.072	0.03023	0.1086

(-) Not applied

(\*) Based on 5% significance level. Shape = 1 tested, Gamma (Cov) = 0 tested

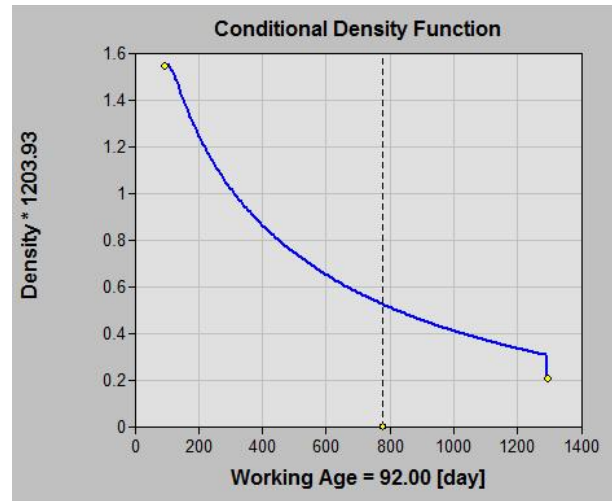
Test for “statistical significance” the found relationship between interruption probability and MaxWind Speed Drop.

## Summary of Goodness of Fit Test

Test	Observed Value	p - Value	PHM Fits Data
Kolmogorov - Smirnov	0.0402135	0.0201051	Rejected (*)

(\*) based on 5% significance level

# Remaining Useful Life Estimate



RUL=180.065828, StdDev=77202.972879

Equal Tails Intervals		Mean-Centered Intervals (Mean = Working Age + RUL)		
Probability	Interval	Mean $\pm$ k*StdDev	Interval	Probability
50%	[335.21, >1293.09]	272.07 $\pm$ 0.50*77202.97	[92.00, 38873.55]	<1.00
60%	[275.71, >1293.09]	272.07 $\pm$ 0.75*77202.97	[92.00, 58174.30]	<1.00
70%	[222.26, >1293.09]	272.07 $\pm$ 1.00*77202.97	[92.00, 77475.04]	<1.00
80%	[174.33, >1293.09]	272.07 $\pm$ 1.50*77202.97	[92.00, 116076.53]	<1.00
90%	[131.37, >1293.09]	272.07 $\pm$ 1.75*77202.97	[92.00, 135377.27]	<1.00
95%	[111.46, >1293.09]	272.07 $\pm$ 2.00*77202.97	[92.00, 154678.01]	<1.00
99%	[95.89, >1293.09]	272.07 $\pm$ 2.50*77202.97	[92.00, 193279.50]	<1.00

# Prediction of Interruption

Recommendation:

**Don't intervene.**

Expect to Replace in [day]:

**1116.53**

Probability of Failure in (7) [day]:

**0.0103549**

Probability of Failure in (14) [day]:

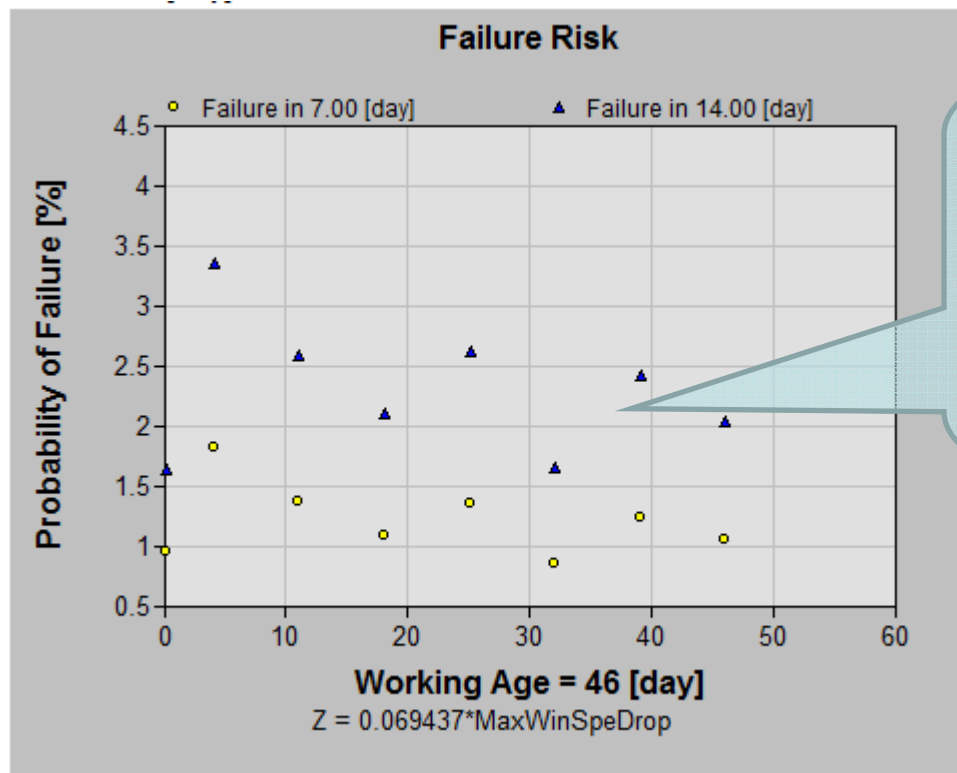
**0.020311**

Report Date:

**09/06/09**

Current Status:

**In operation**



Probability of interruption in:

- 7 days (yellow points)
- 14 days (blue triangles)

# Area Summary under 3 modes

criteria		Ops 4	Ops 5	Ops 6	Ops 7	Ops 8	Ops 9	Ops 10	Ops 11	Ops 12	
2000	<b>All failure modes combined</b>	Sample Size	335	658	488	583	423	682	547	390	712
		Failed (EF)	87	251	143	152	115	289	109	93	229
		Censored (ES)	61	99	36	112	50	76	121	59	116
		Temp Censored (ES)	187	308	309	319	258	317	317	238	367
		Shape $\beta$ (Estimate)	0.7717	0.8343	0.9547	1.012	0.8217	0.9291	0.9196	1.111	0.8672
		Scale $\mu$ (Estimate)	4356.17	2041.84	3314.2	3026.46	4158.17	1668.34	4782.06	3316.8	2662.71
		Mean Life (Estimate)	5069.78	2247.95	3383.8	3012.05	4624.57	1726.22	4974.05	3190.43	2861.77
		Goodness of Fit Test p-value	0.0021	0.0003	0.5306	0.8729	0.0099	0.1255	0.3059	0.2805	0.008
		Scale and Mean Life (Shape fixed to 1)	3137.74	1791.16	3154.5	3063.67	3275.17	1601.08	4245.57	3735.56	2339.51
		5500	<b>Failure mode "Tree fallen"</b>	Sample Size	222	489	370	383	280	496	410
Failed (EF)	14			110	49	19	11	143	21	16	102
Censored (ES)	21			71	12	45	11	36	72	26	62
Temp Censored (ES)	187			308	309	319	258	317	317	238	367
Shape $\beta$ (Estimate)	1.143			0.9927	1.295	1.569	1.013	1.117	1.511	2.214	1.061
Scale $\mu$ (Estimate)	13963.9			4125.7	5937.2	8618.31	32835.3	2908.14	8525.51	4800.37	4830.84
Mean Life (Estimate)	13315.1			4138.63	5487.8	7741.57	32655.2	2791.97	7689.5	4251.43	4720.24
Goodness of Fit Test p-value	0.6257			0.9316	0.0937	0.0984	0.9645	0.1592	0.0986	0.0215	0.5265
Scale and Mean Life (Shape fixed to 1)	19500.6			4086.63	9205.8	24511.3	34242.4	3236	22037.4	21716.4	5252.7
5500	<b>Failure mode "Equipment / Material failure"</b>			Sample Size	236	436	381	440	334	412	442
		Failed (EF)	28	57	60	76	65	59	53	40	68
		Censored (ES)	21	71	12	45	11	36	72	26	62
		Temp Censored (ES)	187	308	309	319	258	317	317	238	367
		Shape $\beta$ (Estimate)	0.7172	0.9646	0.8994	1.067	0.8242	1.375	0.9931	1.267	1.08
		Scale $\mu$ (Estimate)	21791.5	8445.84	9157.9	5542.05	8000.63	4800.78	8848.3	5824.44	6873.05
		Mean Life (Estimate)	26967.2	8581.43	9639.1	5404.41	8879.55	4388.53	8874.51	5408.7	6672.58
		Goodness of Fit Test p-value	0.0294	0.7657	0.3646	0.5575	0.0679	0.0242	0.9565	0.1551	0.5104
		Scale and Mean Life (Shape fixed to 1)	9747.14	7887.43	7518.2	6127.71	5794.79	7842.87	8731.94	8686.59	7879.23

# Part IV

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# Conclusions

# Conclusions

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- There are many opportunities to move our businesses forward when we look for them!
  - Analysis can be done with internal or external variables
- Analysis may be carried out on small machines in a plant or on equipment covering an area the size of the province of Ontario
- Data can be in many structures and formats

# Conclusions

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- More data over time improves the opportunity for analysis and decision making
- Closing the “crevice” is much more than creating a few tables
  - It has lead to additional opportunities for exploration and mining of the data
- The process is easy to use and manages hundreds of thousands of records and data

# Conclusions

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- BI-Cycle together with OMDEC know-how and Hydro One business expertise provide the necessary data processing methods to feed EXAKT
- EXAKT provides the mathematical algorithms  
to

# Conclusions

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move from a foggy



to a clear view

and CLOSE the CREVICE!

Click for next

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# Closing the Crevice

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- With this process implemented, we are moving forward in our analysis and decision making
- There's no worry even when



deer get tangled in the wires

Click for next

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# Thank You

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Norm.Hann@**HydroOne**.com

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  - Bo Ji, David Chan, Dipin Puri
- OMDEC:
  - Murray Wiseman, Daming Lin
- BI-Cycle:
  - Joan Dorrepaal

