

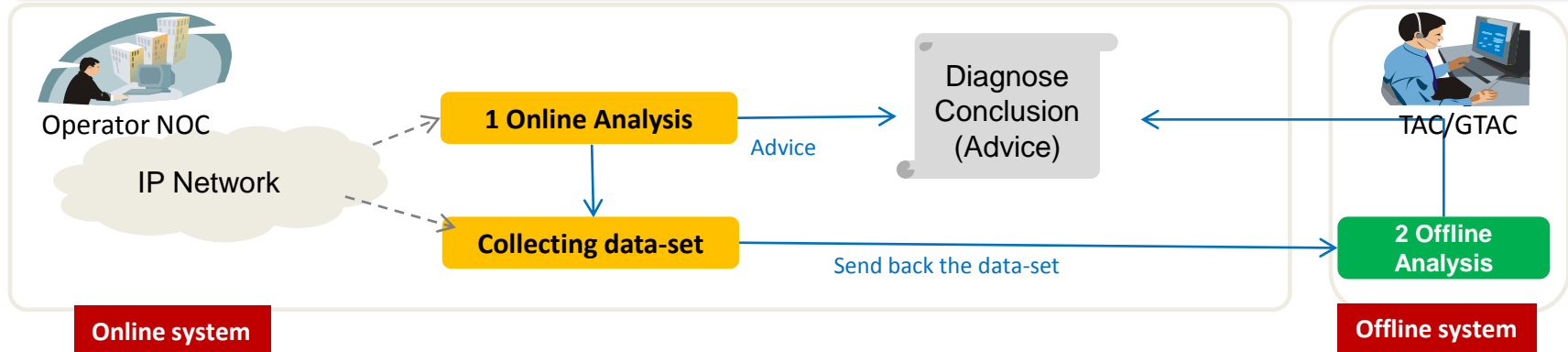
Research on Network Fault Analysis based on Machine Learning

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Example Scenario of Big data analysis

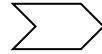
- **Goal: Combine the offline and online analysis system to support the fast recovery of fault**
- **Online Analysis:** Deployed in customer side, detect the fault at real-time, could give out the advice
- **Offline Analysis:** Deployed in TAC/GTAC, provide the service for the global customs, help engineer to locate the fault and give the advice



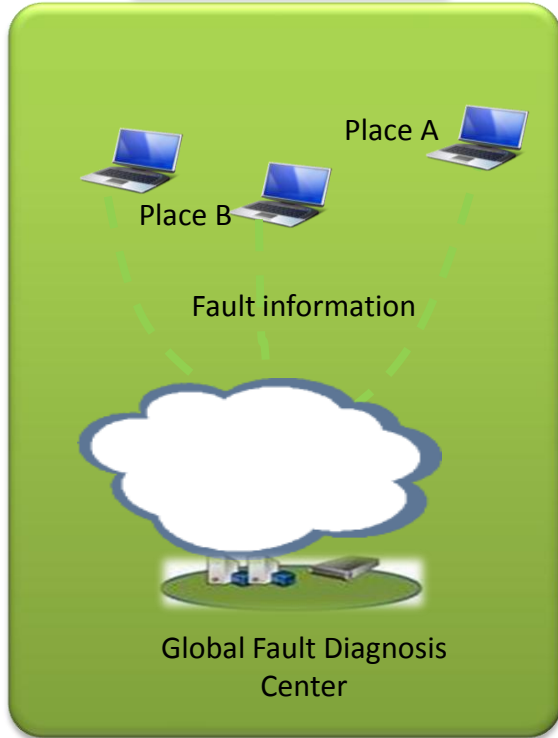
No	System	User	Feature
1	Online Analysis	Customer	<ul style="list-style-type: none"> ❑ Proactive monitoring of the state of functioning and health of telecommunication equipment ❑ The detection of the earliest symptoms of a malfunction for network devices ❑ Correlation analysis on the basis of the multiple data sets
2	Offline Analysis	TAC/GTAC	<ul style="list-style-type: none"> ❑ Data Visualization to help user get the insight to the fault. ❑ The detection of the fault of a malfunction for network devices ❑ Correlation analysis on the basis of the multiple data sets

Offline Scenario for Fault Analysis

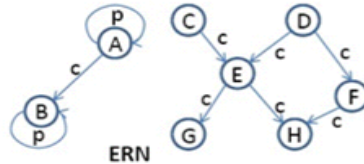
Data upload



Automatic Fault Analysis



Visualization



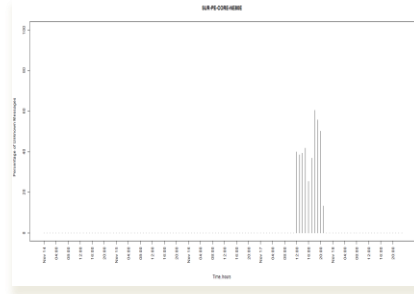
KPI Analysis

Traffic anomaly

17:20

■ Related analysis
 ■ 17:20 shutdown
 Command

Anomaly analysis



Correlation analysis

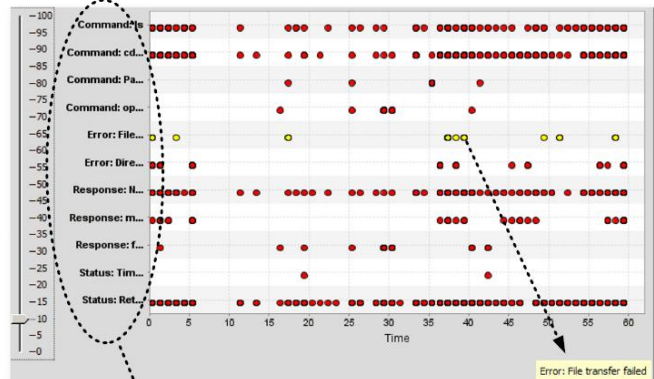
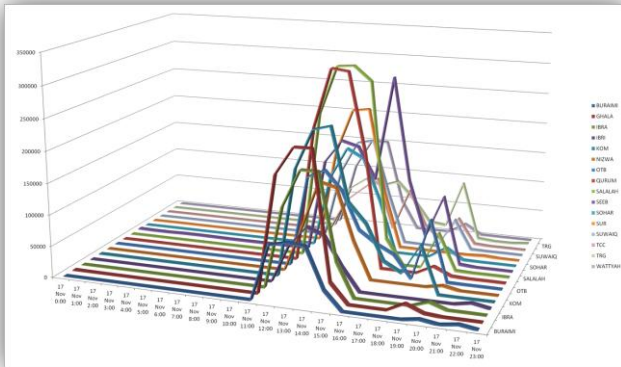
items support

1 {BFD BFD_DOWN_TRAP ,
 BFD CRTSESS ,
 BFD DELSESS ,
 BFD STACHG_TODWN ,
 BFD STACHG_TOUP ,
 OSPF NBRCHG ,
 OSPF NBR_CHANGE_E ,
 OSPF NBR_CHG_DOWN ,
 OSPF NBR_DOWN_REASON ,
 OSPF OGNLSA } 0.2523030

Visualization— —Get the insight to fault

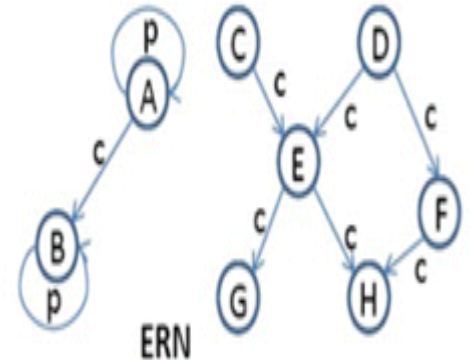
Value

- 1 Filter unnecessary information
- 2 Statistical analysis of events



Created System Events

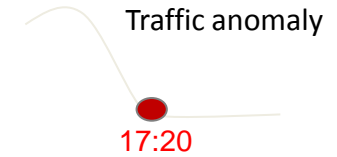
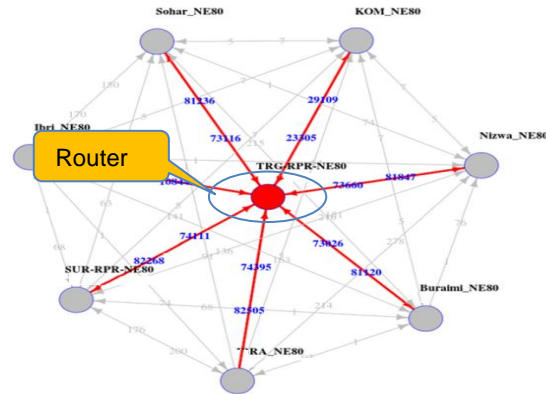
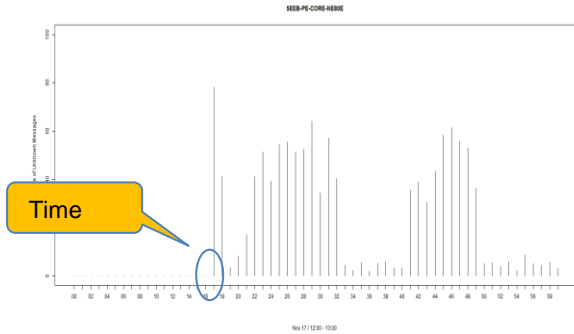
An Error Message about File transfer



Anomaly Detection

Value

- 1 Find the possible fault time
- 2 Find the possible device
- 3 Find the possible module



- Related log files
- 17:20 shutdown Cmd

Visualization—Event Summarization

Log Analyzer v1.0

Search...

- DataSource
- Event Extraction
- Event Dashboard
- Event Mining
- Multiresolution Retrieval
- Dynamic Query Form

Event Summarization

Data Sets

ID	Name	Start Time	Running Time	Staus
<input type="radio"/> 0	Huawei_log_1	10:22 AM 8/1/2014	10 hours	Ready
<input type="radio"/> 1	Huawei_log_2	11:12 AM 8/3/2014	2 hours	Running
<input type="radio"/> 2	IBM_log_1	N/A	N/A	Not Yet
<input type="radio"/> 0	Huawei_log_3	14:22 AM 1/1/2015	10 hours	Ready
<input type="radio"/> 1	Huawei_log_4	15:22 AM 2/2/2015	2 hours	Running
<input type="radio"/> 2	IBM_log_2	N/A	N/A	Not Yet

Select Pattern Type:

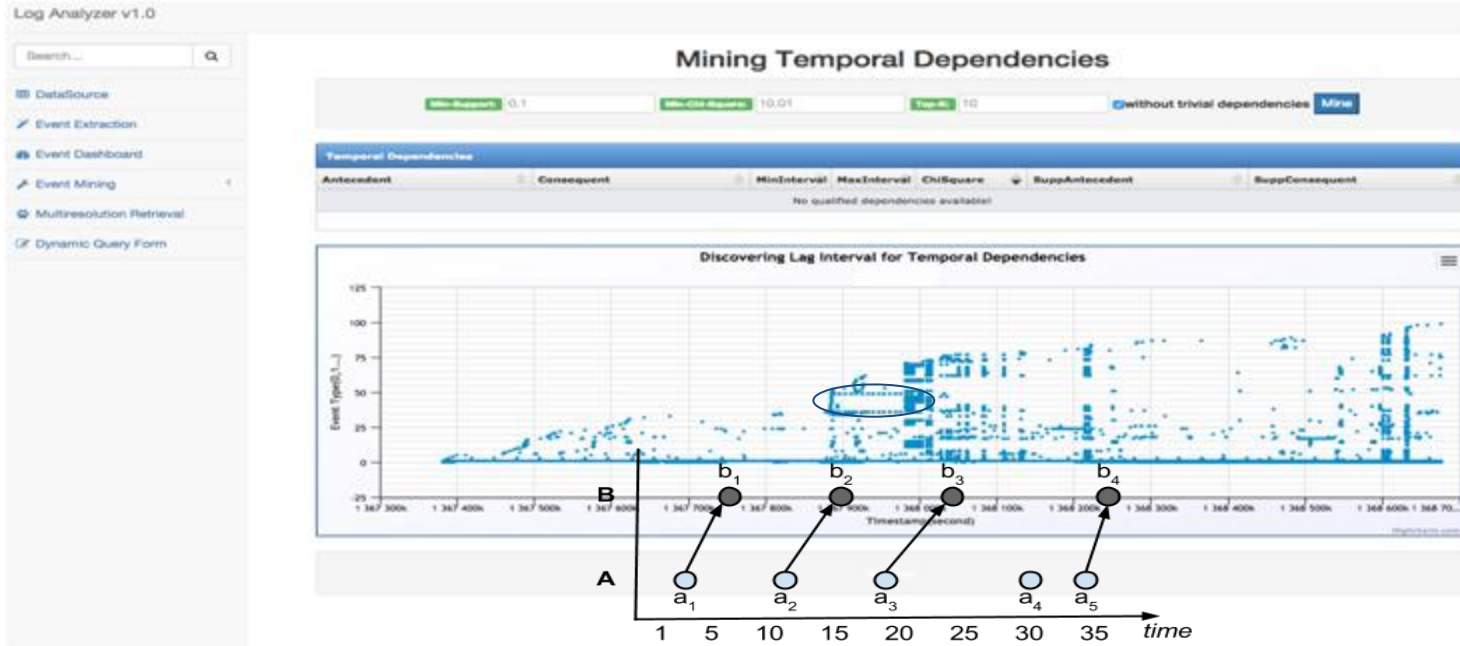
Corolation
 Periodic

Plot Pattern Start Mining Stop Mining

```
graph TD; A((A)) -- 0.5 --> B((B)); B((B)) -- 1.2 --> D((D)); D((D)) -- 0.7 --> B((B)); D((D)) -- 0.7 --> C((C)); D((D)) -- 0.2 --> E((E)); F((F)) --> F((F))
```

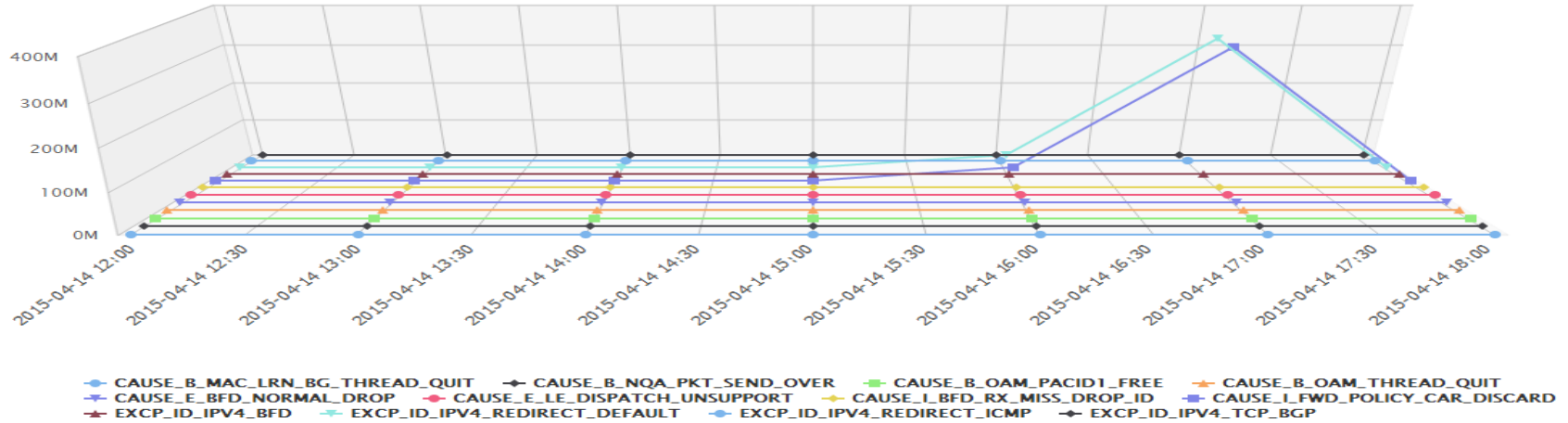
- Get the event summarization between different events, and find the relationship between them.

Visualization — — Lag interval



- Time lag is a key feature of hidden temporal dependencies within sequential data.

Anomaly Detection——KPI



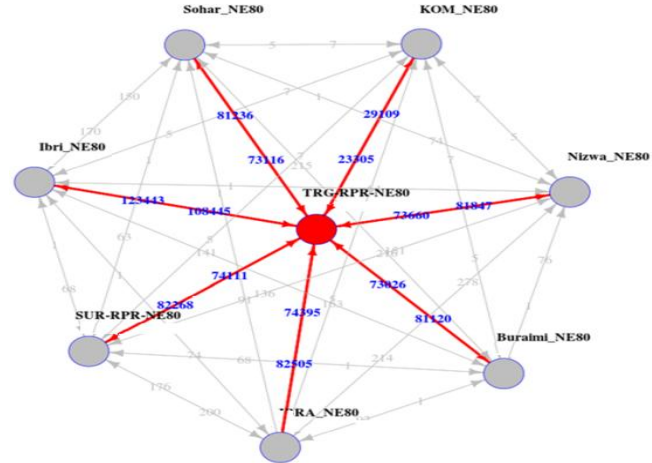
分析结果 上一页 下一页 到第 页 共 1 页 (每页 条)

异常时间	设备	槽位	异常ID	丢包数量/分钟
2015-04-14 16:56:00	79-4-8-Floor-HW-PTN2	1	CAUSE_I_FWD_POLICY_CAR_DISCARD EXCP_ID_IPV4_REDIRECT_ICMP EXCP_ID_IPV4_REDIRECT_DEFAULT EXCP_ID_IPV4_TCP_BGP	10256137 10255106 4 21

Help the operators find the root cause KPI among a list of KPIs, and find the fault time.

Anomaly Detection— —Multiple log files

row.names	KOM_NE80	TRG-RPR-NE80	Buraimi_NE80	IBRA_NE80	Ibri_NE80	Nizwa_NE80	Sohar_NE80	SUR-RPR-NE80
1 KOM_NE80	0	23395	5	5	5	5	5	5
2 TRG-RPR-NE80	79109	0	81120	82595	123443	81847	81236	82268
3 Buraimi_NE80	7	73026	0	92	141	76	215	68
4 IBRA_NE80	7	74395	1	0	1	278	1	176
5 Ibri_NE80	7	108445	163	74	0	64	150	68
6 Nizwa_NE80	7	73660	1	214	1	0	1	136
7 Sohar_NE80	7	73116	216	91	170	74	0	63
8 SUR-RPR-NE80	7	74111	1	200	1	151	1	0



KOM_NE80\0.1243918	TRG-RPR-NE80\1.0000000	Buraimi_NE80\0.3666137	IBRA_NE80\0.3731849
Ibri_NE80\0.5507581	Nizwa_NE80\0.3697645	Sohar_NE80\0.3671156	SUR-RPR-NE80\0.3717175

Interaction frequency matrix for ISIS protocol messages

Output of the Rage Rank algorithm

- Find the root cause router based on the interaction of the protocol

Thank you
Comments?