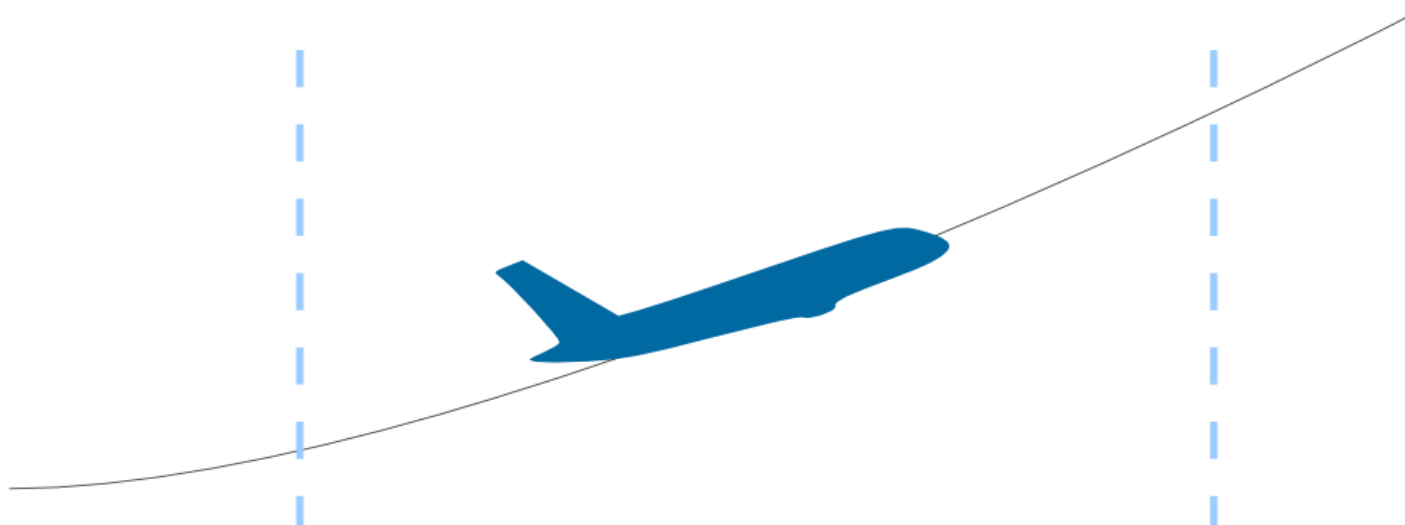


# Reducing rate of false FDM events

## EOFDM conference – Köln – 23/01/2013

Edouard Garnier de Labareyre  
*FDM System Engineer - Sagem*

Thierry Donadey  
*Flight Data Analysis Expert – Air France*



# Context of this project

## → Internal algorithms refactoring at Air France

- Current observation : difficulties to have reliable statistics which are representative of the reality
- Complete re-engineering of FDM procedures in progress

## → What is Svetlana ?

- E.U. – Russian project with Sagem (2010-2012): Improving flight data analysis with new techniques such as data-mining
- One of the topic of the project was the improvement of existing FDM process

*The research leading to these results has received funding from the European Union Seventh Framework Programme (FP7/2007-2013) under grant agreement n ACPO-GA-2010-265940 SVETLANA.*

# Context of this project

## → Air France – Sagem collaboration within Svetlana

- Sharing of skills:

operational FDM experience + software expertise

**AIRFRANCE** 

 **SAFRAN**  
Sagem

- Improve analysis results quality as well as reusability
- Promote documented procedures
- Validate a workflow for high quality procedures development

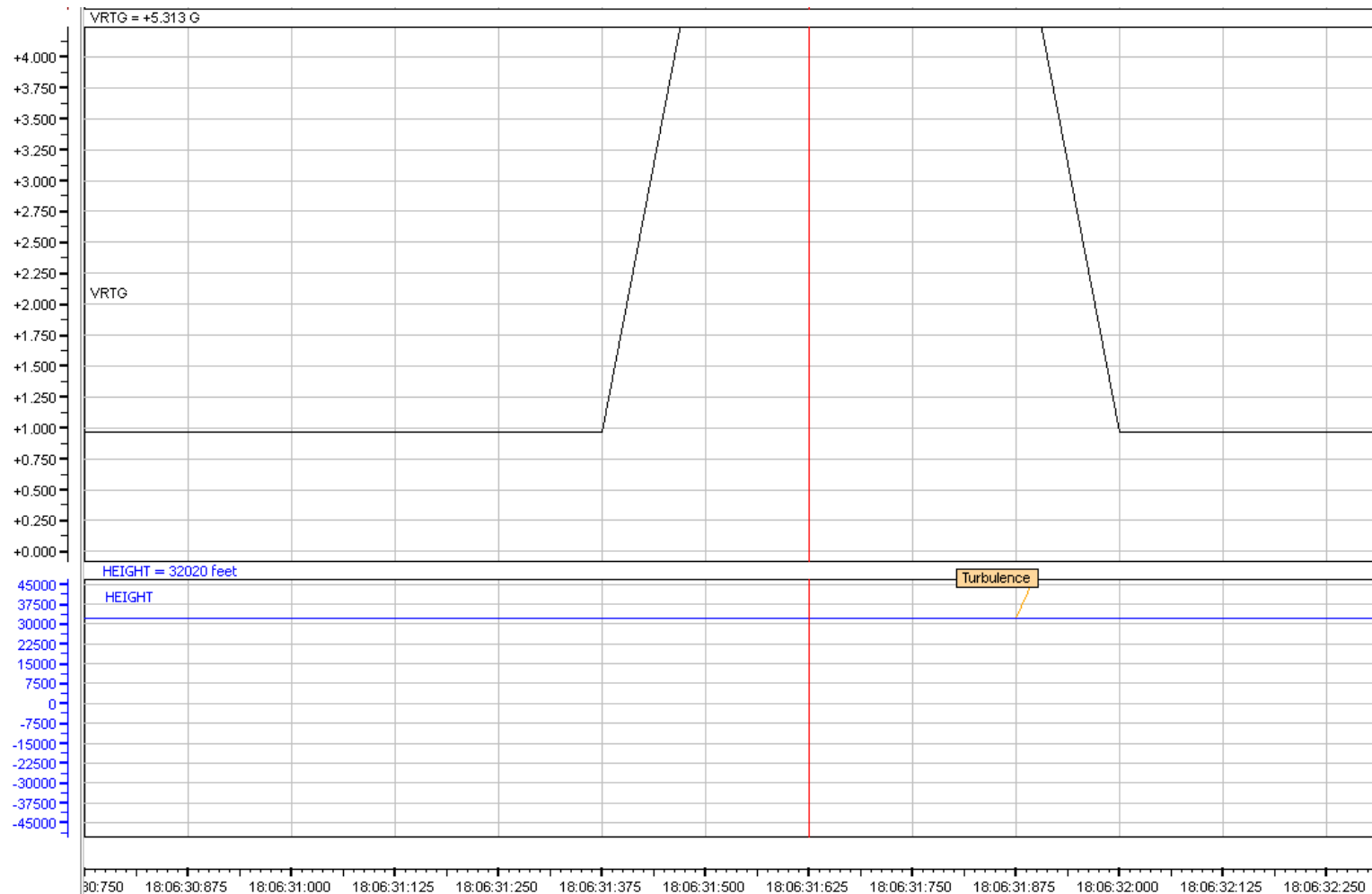
# Summary

- 1) Understanding the causes of false events
- 2) Detecting and correcting invalid parameters
- 3) Using parameter invalidity information
- 4) Results for Air France fleet
- 5) Conclusion

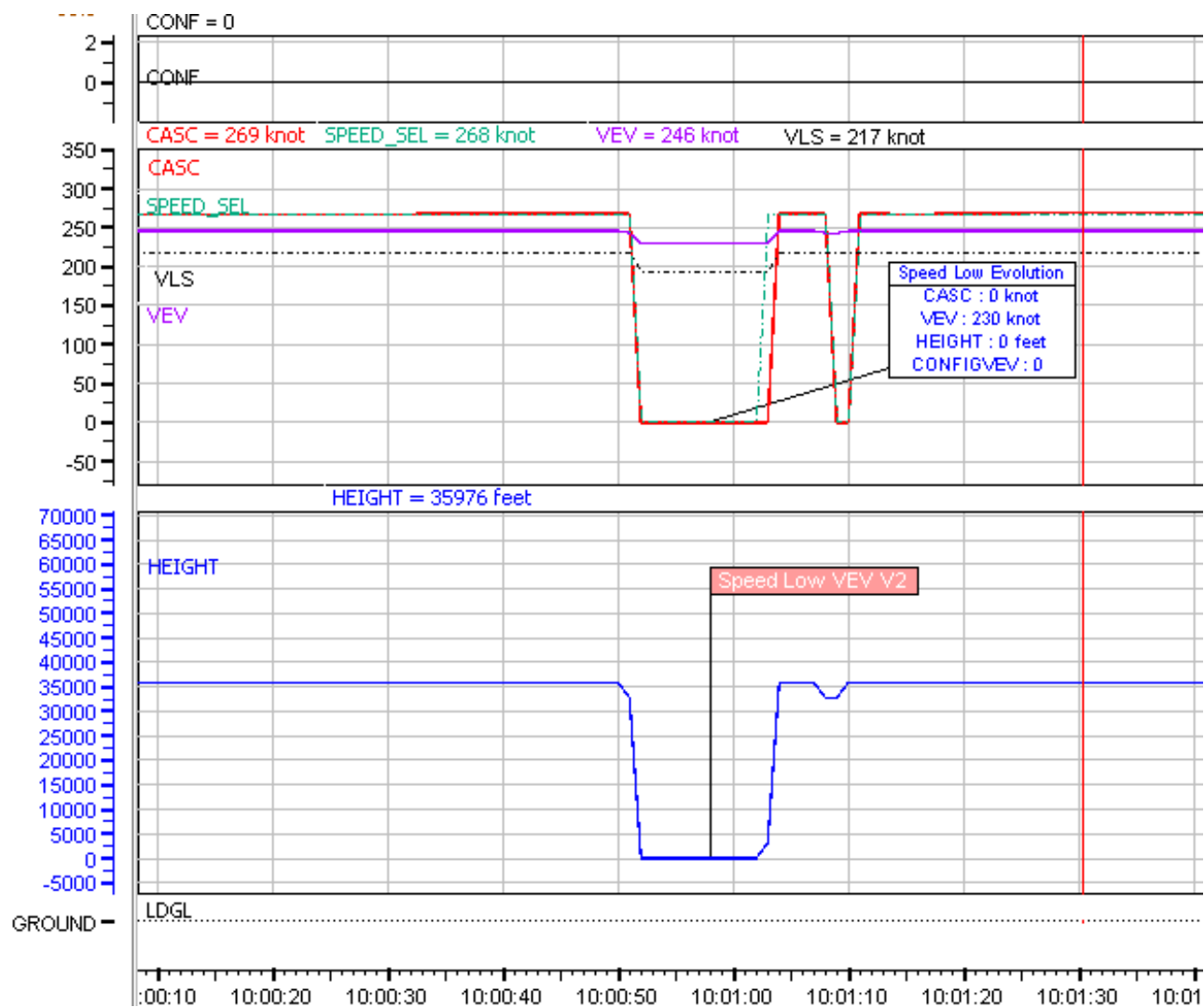
# Understanding the causes of false events

Examples

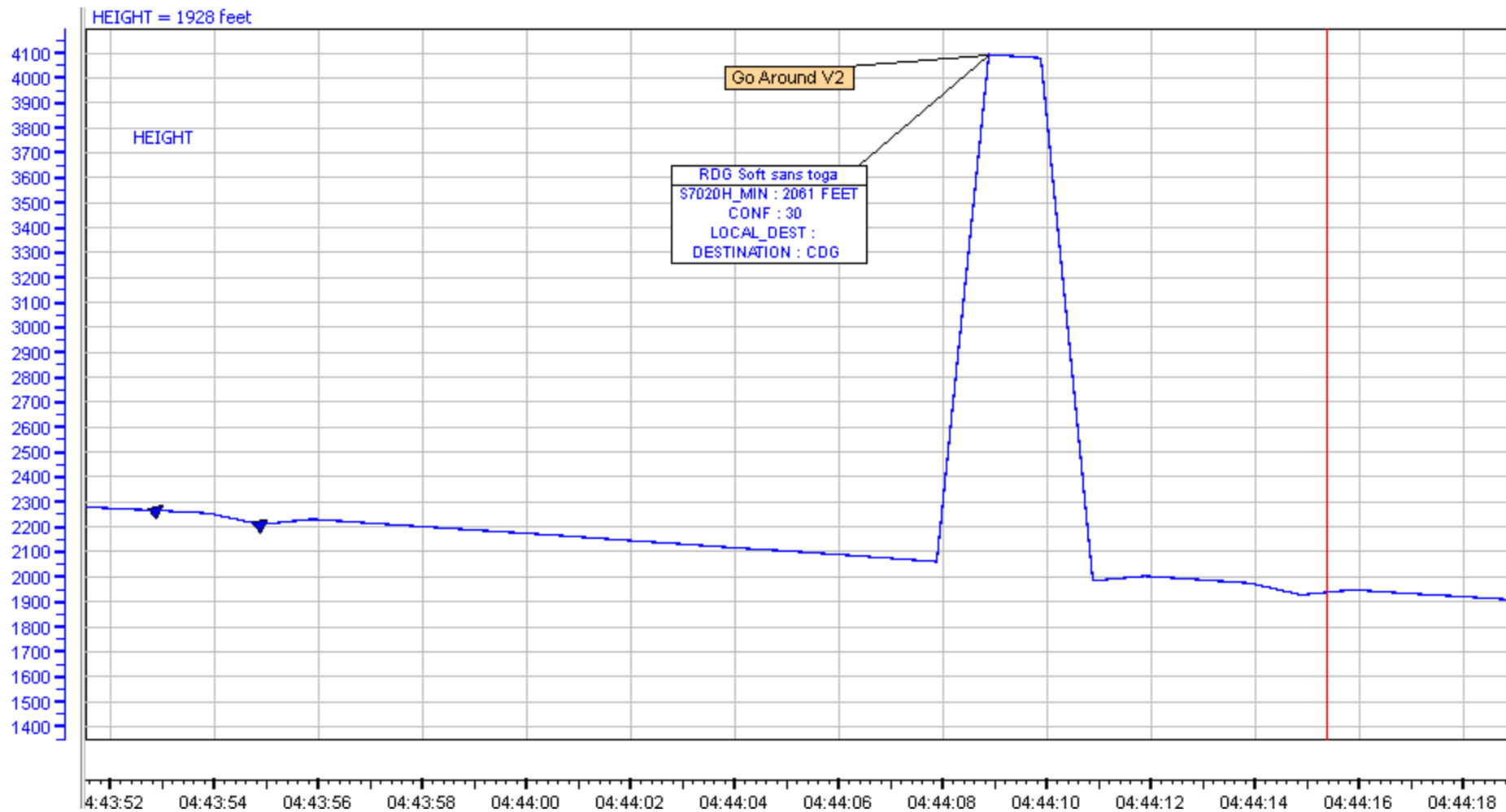
# False “SevereTurbulence” (VRTG involved)



# False "Speed low" (CAS involved)



# False “Go around” (ALT STD involved)





# Identification of responsibilities in false event detection

“A chain is only as strong as its weakest link”

## Weak detection algorithm

- If the algorithm is too dependant on a single parameter, or not covering enough from possible situations, it will fail in any unexpected situation
- Will not be developed in this presentation, but is also part of the project

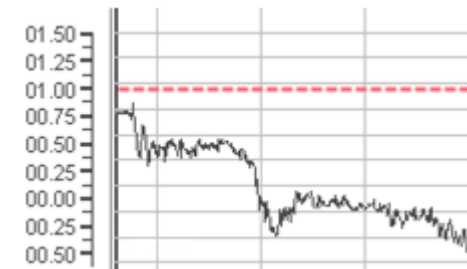
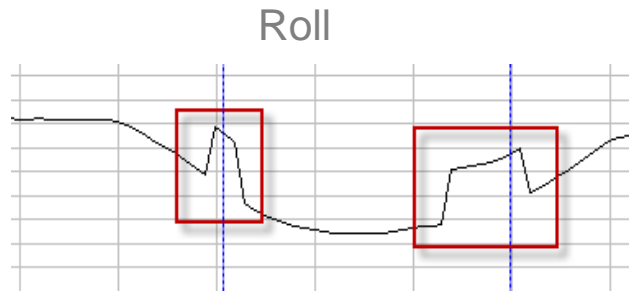
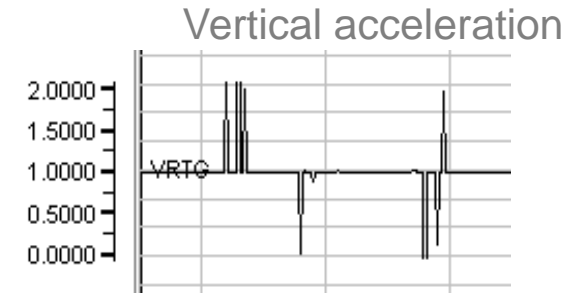
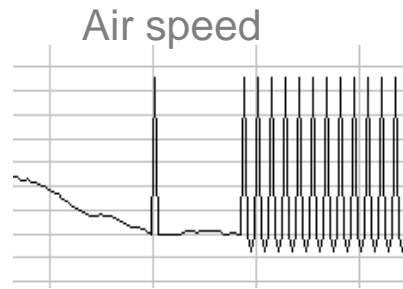
## Bad input data

- Input data can be noisy, which often cause a simple algorithm to fail
- Two approaches
  - filter data in each event algorithm
  - filter data once and for all

# Detecting and correcting invalid parameters

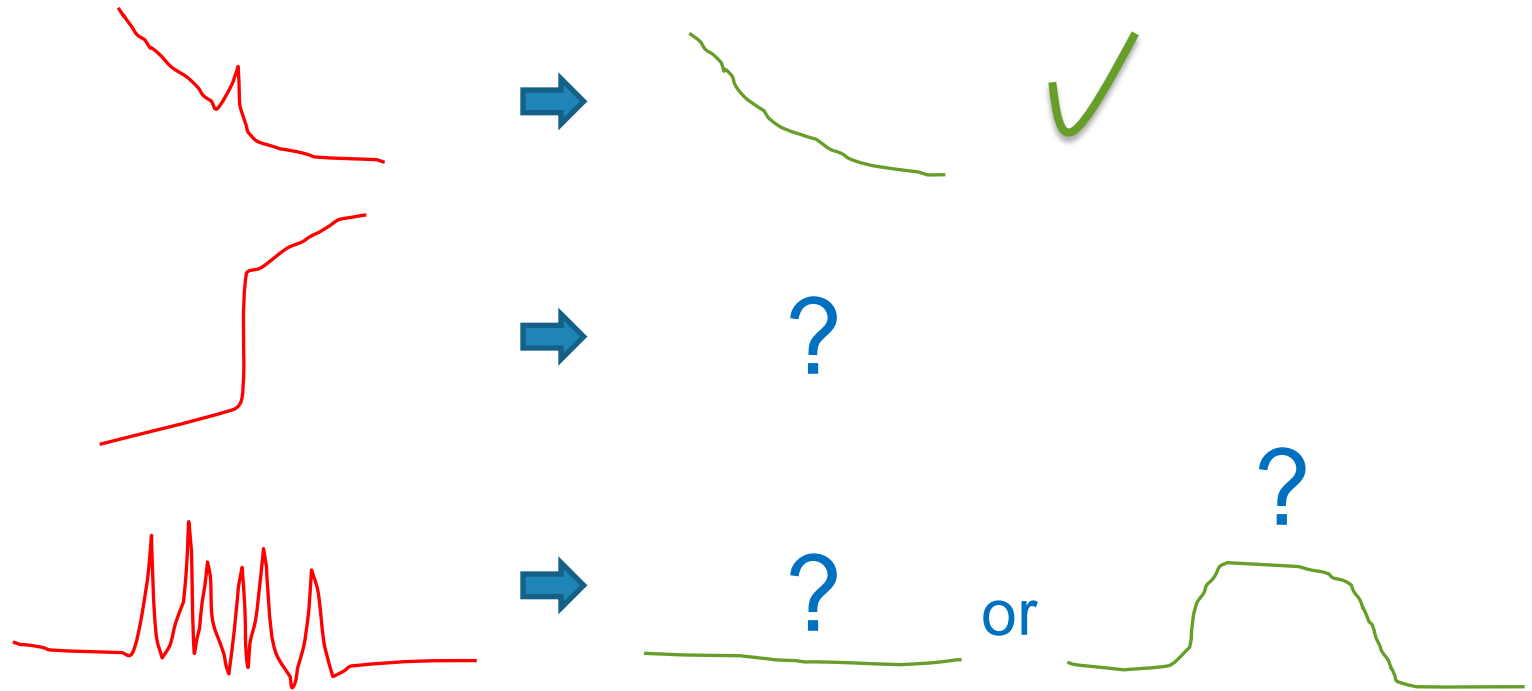
Theory

# Looking for patterns



- ➔ Peaks, isolated or grouped
- ➔ Value gaps
- ➔ Parameter out of normal range

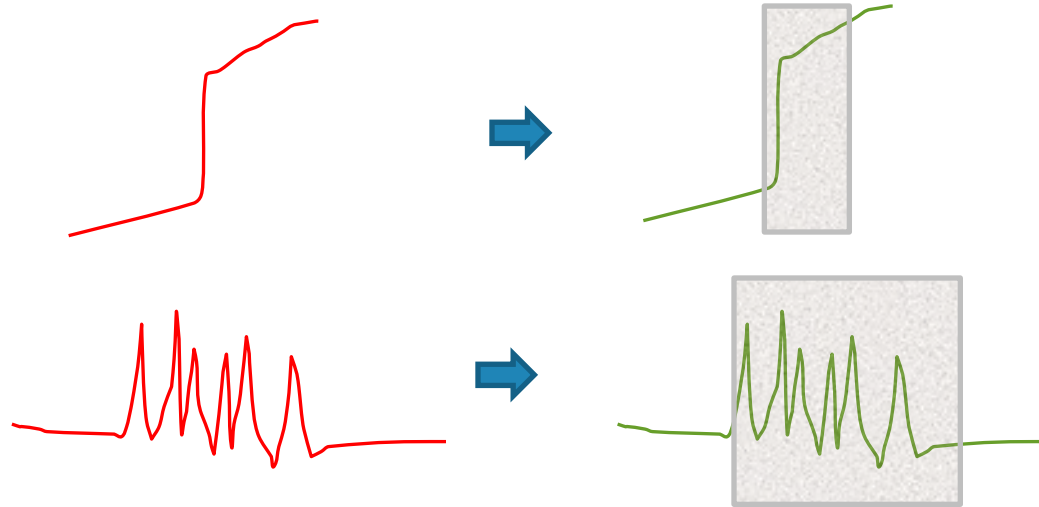
# Correction is not enough



- It is often not possible or not reasonable to correct the parameter value.
- We cannot honestly tell that a parameter is “corrected” if we are not confident in the correction that has been applied

# Parameter invalidation

→ When no correction is possible, the parameter should be **invalidated**

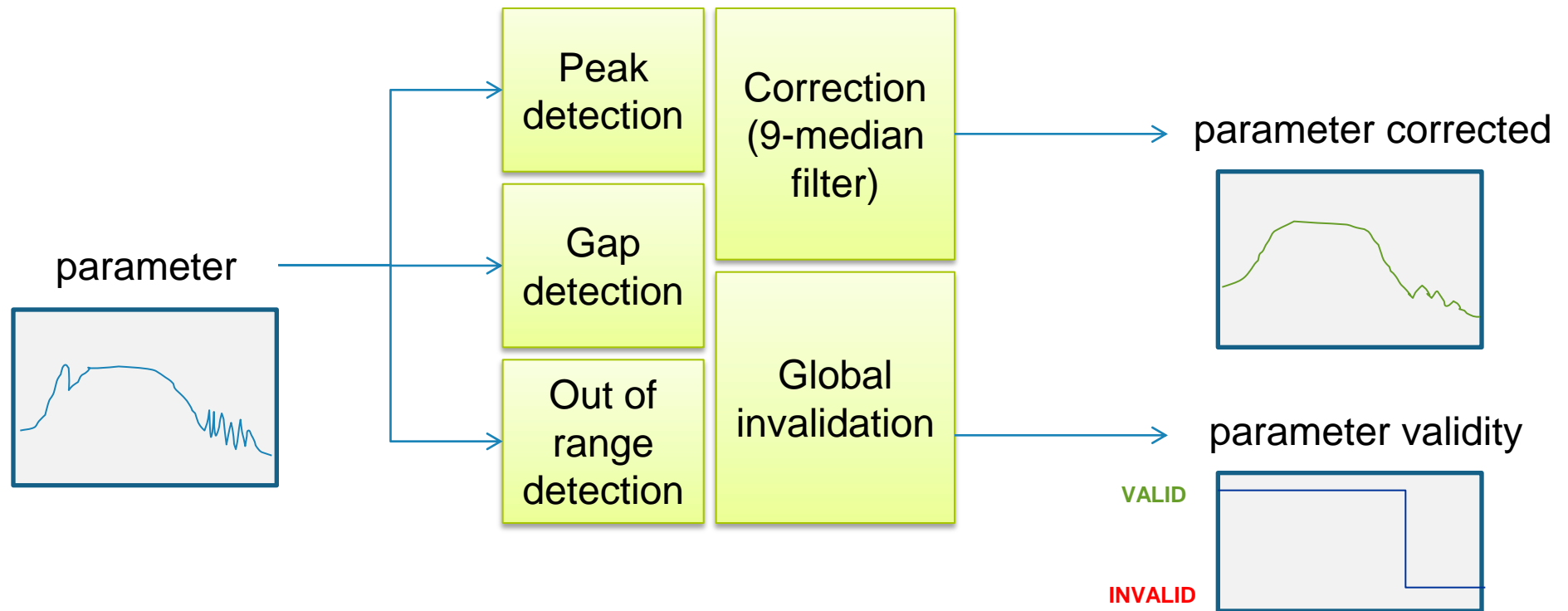


→ What an invalidation means:

“This parameter **should not be used** during this period, because it was not possible to correct it with a sufficient level of confidence.”

→ Need to attach a boolean “validity” parameter to each parameter we want to monitor

# Implementation



# Median Filter

→ Input 9 elements

5	9	3	1000	15	11	7	17	13
---	---	---	------	----	----	---	----	----

→ Sort

3	5	7	9	11	13	15	17	1000
---	---	---	---	----	----	----	----	------

→ Result is the element in median position

				11				
--	--	--	--	----	--	--	--	--

# Using parameter invalidity information

In practice



# Impact on existing algorithms

→ **Any algorithm** can start using parameter invalidation and correction by introducing a **simple test** on parameter invalidation

## BEFORE

```
IF ( CAS > limit ) THEN  
    EVENTV(...)  
ENDIF
```

## AFTER

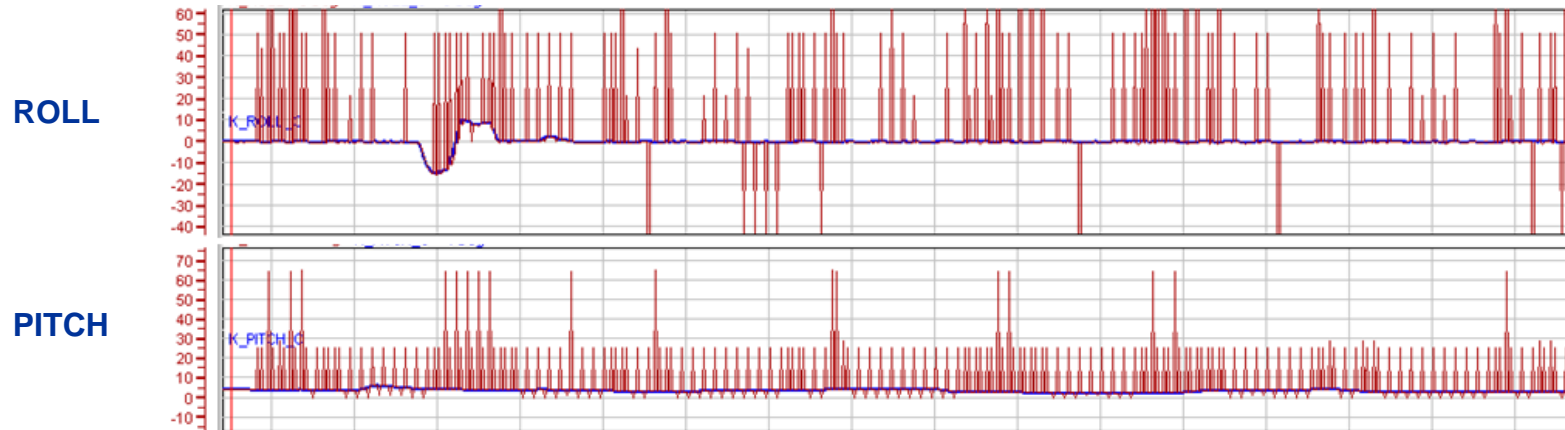
```
IF ( CAS_VALID ) THEN  
    IF ( CAS_CORRECTED > limit ) THEN  
        EVENTV(...)  
    ENDIF  
ENDIF
```

→ But this could also be used in other powerful ways

- Behave in degraded mode if one of the parameters needed for the computation is invalid
- Use it for additional parameter computation
- Anything else you could imagine that uses PARAM\_VALID and PARAM\_CORRECTED !

# The invalidation paradox

→ If we stop here, we're still missing something...



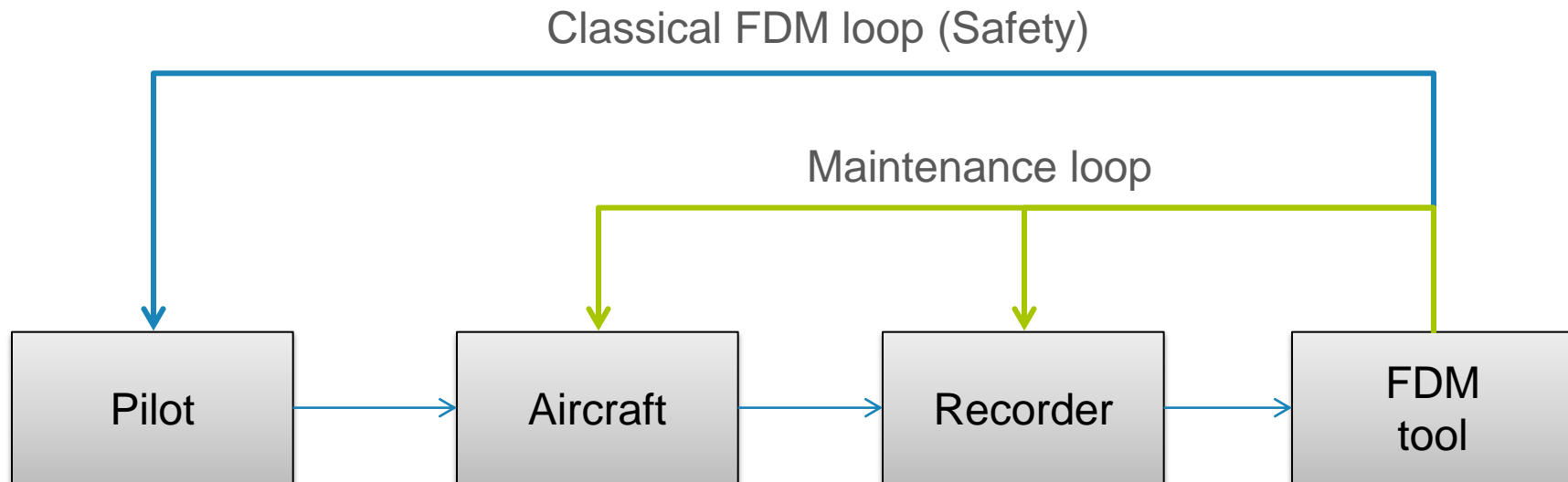
Chances are strong that this flight doesn't raise any event about parameter PITCH or ROLL as it's quite always invalid ! Yet this flight deserves to be seen.

→ Need a **maintenance event** that monitors the **invalidity ratio** on the whole flight, for each parameter which goes through invalidation & correction algorithms.

```
cas_invalidity_ratio = TOTAL_INVALID_SAMPLES / TOTAL_SAMPLES
IF ( cas_invalidity_ratio > 0.25 ) THEN
    EVENTV(...)
ENDIF
```

# Improving FDM workflow

- Having this new **maintenance oriented event** on parameter validity reinforces the **maintenance retroaction loop** of the FDM process



# Results on Air France fleet ( B747 & A340 )

Earnings

# Overview of Air France fleet

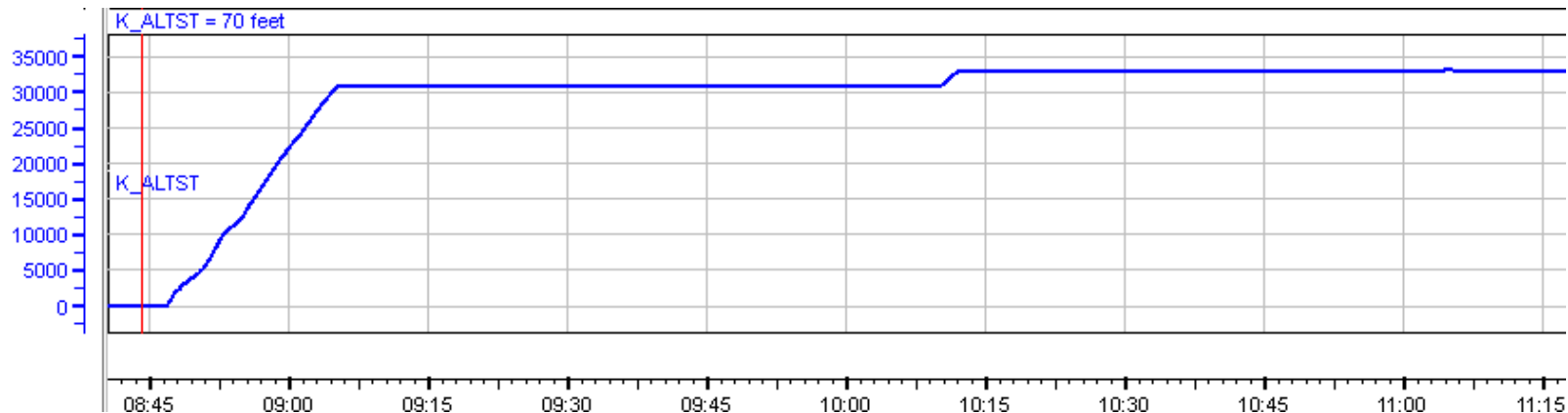
## → AF Fleet

- 256 aircrafts
- 820 flights per day

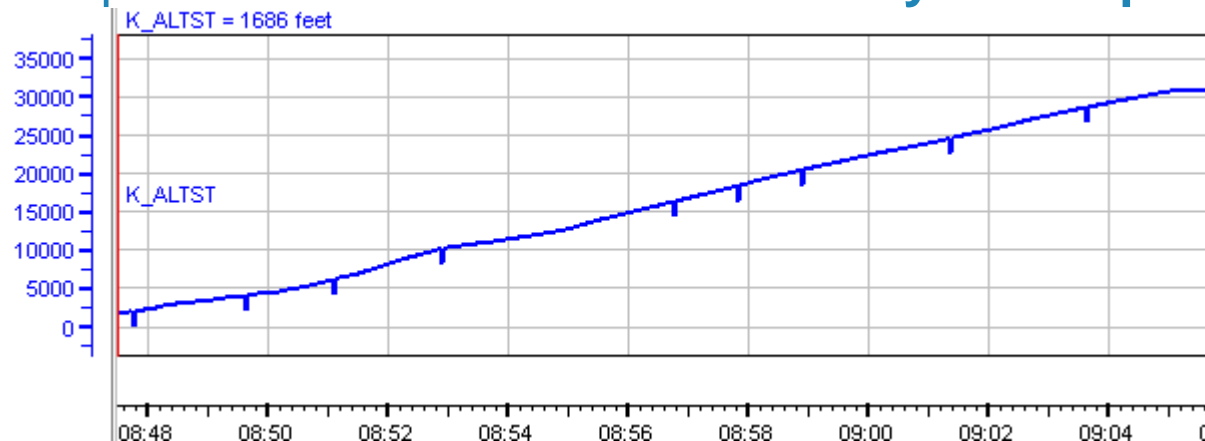
Fleet	Aircraft Number	Flight / year
A320	146	240 162
A330	15	10 353
A340	13	7 141
A380	8	3 786
B747	10	4 772
B777	64	32 226

# « Shift » definition

→ Parameter apparently correct: **analysis possible with human eye**



→ Zoom on this parameter show some shifts: **analysis not possible for IT system**



# Results for AF B747 fleet

- Replay of B747 flights for year 2011
- Non corrected and corrected parameter shift number measuring.
- Shift threshold :
  - CAS : 30kts
  - ALTST : 300ft
  - PITCH : 10
  - ROLL : 10

Parameter	Shift number on input param	Shift number on corrected param	%
CAS	38 797	45	99.9
ALTST	297 568	2 110	99.3
PITCH	1 086	57	94.8
ROLL	919	120	86.9

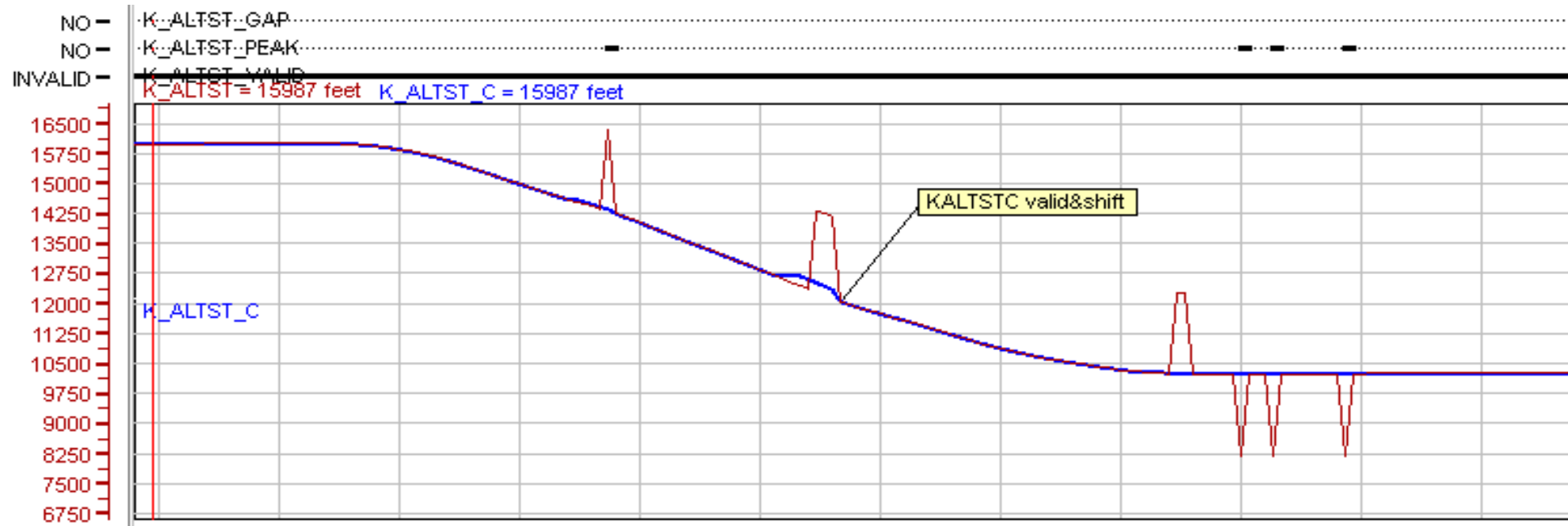
# Results for AF A340 fleet

- Replay of A340 flights for year 2011
- Non corrected and corrected parameter shift number measuring.
- Shift threshold :
  - CAS : 30kts
  - ALTST : 300ft
  - PITCH : 10
  - ROLL : 10

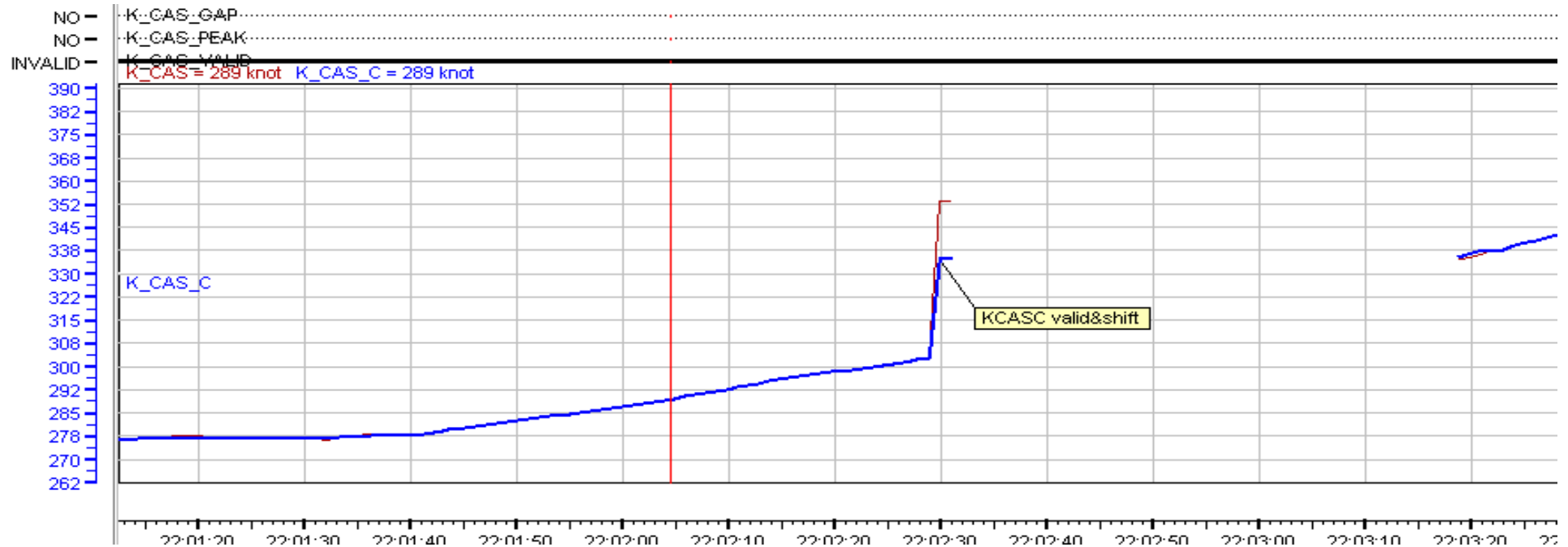
Parameter	Shift number on input param	Shift number on corrected param	%
CAS	15 085	2 773	81.6
ALTST	127 198	1 682	98.7
PITCH	35 174	0	100.0
ROLL	36 644	83	99.8



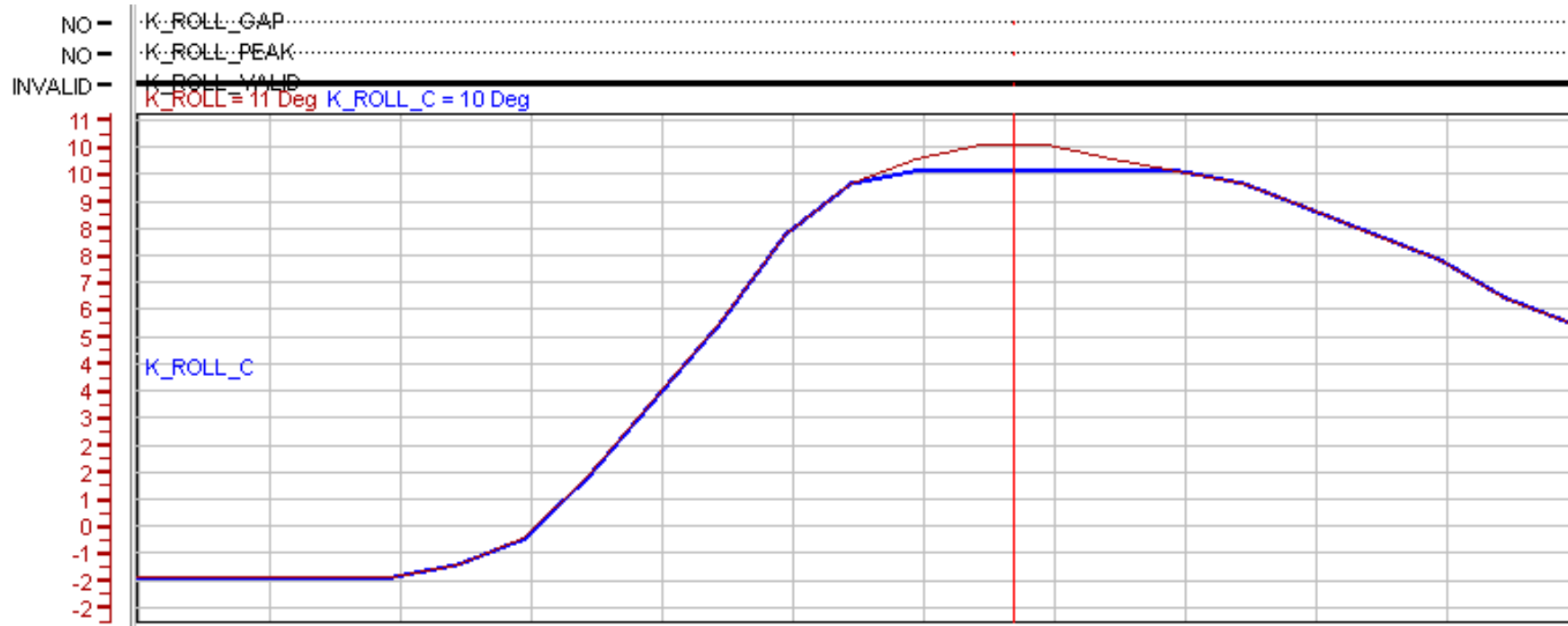
# Parameter correction with median filter



# Gap detection not robust enough



# Median filter clipping



# Conclusion

- **Successful** and very rich **cooperation** between two types of expertise
- A promising start, still some things to improve
  - Dealing with the parameters which don't support well the 9-median filter (e.g. PITCH & ROLL) with adaptive median filter
  - Retrofit of the whole event detection set to use parameter invalidity
  - Improvement of some event detection algorithms
  - Covering the whole event set
- Paves the way to a **common set of procedures** in the AGS
- This work also led to the development of a methodology