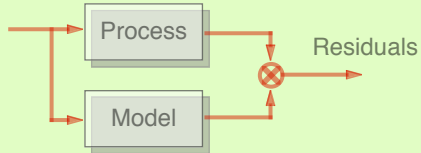


Fuzzy evaluation of residuals in FDI methods Application to a urban water supply network

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Fuzzy evaluation of residuals in FDI methods



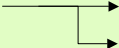
- ◆ Problem statement
- ◆ Recall about classical approaches
- ◆ Non Boolean approach
- ◆ Enhancements
- ◆ Application
- ◆ Conclusion

FDI method

Generation of residuals

Sensitive to faults to be detected
Insensitive to model uncertainties
Insensitive to perturbations

Evaluation of residuals

Statistical decisions  Boolean
Non Boolean

Classical approach

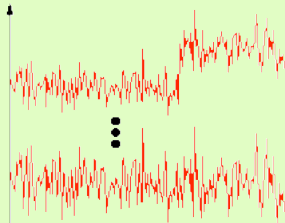
Set of residuals

$$\begin{cases} r_1 = f_1(+x_1, -x_2) \\ r_2 = f_2(-x_1, +x_3) \\ r_3 = f_3(-x_1, -x_2, +x_3) \\ r_4 = f_4(+x_2, -x_3) \end{cases}$$

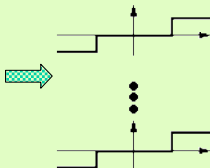
Theoretical ternary fault signature matrix

$$\Sigma = \begin{pmatrix} +1 & -1 & 0 \\ -1 & 0 & +1 \\ -1 & -1 & +1 \\ 0 & +1 & -1 \end{pmatrix}$$

Comparison



Experimental residuals



0	0	0	0	1	1	1	1
⋮	⋮	⋮	⋮	⋮	⋮	⋮	⋮
0	1	0	0	1	0	0	-1

Experimental signatures

Non Boolean evaluation

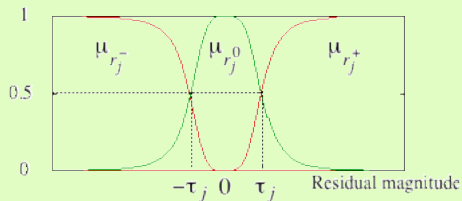
Three fuzzy sets per residuals :

“negative” : r_i^-

“null” : r_i^0

“positive” : r_i^+

Shape of membership functions :



Fault localization :

Conjoined analysis of residuals and theoretical ternary fault signature matrix

Non Boolean evaluation

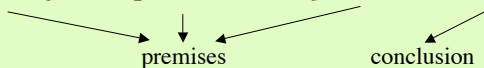


Signature matrix  Rule base

Example :

Fault signature : $(1 \ -1 \ 0)^T$

Corresponding rule : if $r_1(k)$ is r_1^+ and $r_2(k)$ is r_2^- and $r_3(k)$ is r_3^0 then f_1^+



$r_1(k)$ is r_1^+  quantification $\mu_{r_1^+}$ Membership grade

and  Conjunction or aggregation operator

Non Boolean evaluation

if $r_1(k)$ is r_1^+ and $r_2(k)$ is r_2^- and $r_3(k)$ is r_3^0 then f_1^+

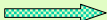
Combination of the membership grades of the premises



Truth degree of the rule

For example : product operator $\mu_{f_1}(k) = \mu_{r_1^+}(k) \mu_{r_2^-}(k) \mu_{r_3^0}(k)$

Fault localization

Highest truth degree of a rule  Most likelihood fault

Enhancements of the method

Calculus of a persistence index

$N(\mu)$

number of values of the membership grade which go beyond a given threshold on a window of L observations

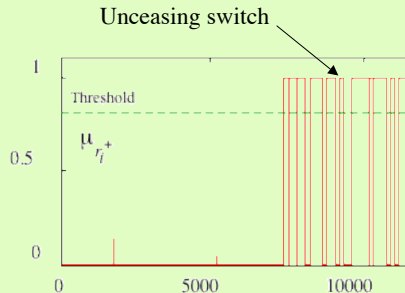
$$p_i = \frac{N(\mu_{r_i})}{L}$$

Modified membership grades taking into account the persistence indexes

$$\tilde{\mu}_{r_i}(k) = f(\mu_{r_i}(k), p_i(k))$$

For example, using product conjunction operator

$$\tilde{\mu}_{r_i}(k) = \mu_{r_i}(k) p_i(k)$$



Enhancements of the method

Integration of the sensitivity of the residuals with regard to faults

d_{ij} magnitude of the fault on the j th variable that implies a deviation of the i th residual greater than a given threshold S

(for example $S = \tau_j$  membership grade equal to 0.5)

Calculus of a kind of “normalized sensitivities”

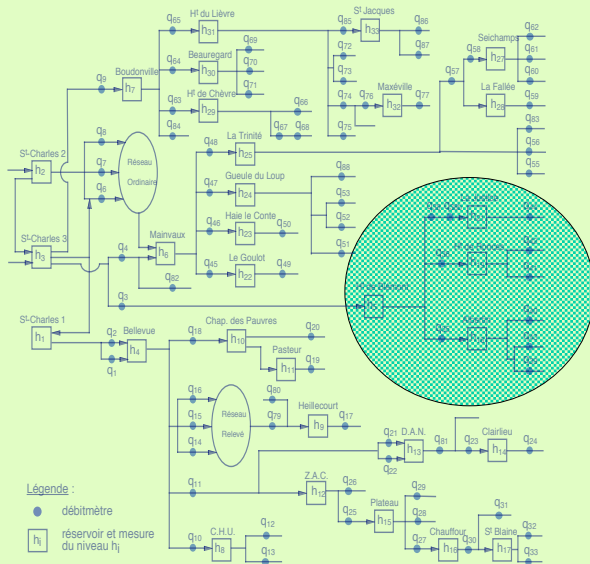
$$\delta_{ij} = \frac{\frac{1}{d_{ij}}}{\sum_j \frac{1}{d_{ij}}}$$

Modified truth degree of fault hypotheses

if $r_1(k)$ is r_1^+ and $r_2(k)$ is r_2^- and $r_3(k)$ is r_3^0 then f_1^+

$$\mu_{f_1^+} = \frac{\mu_{r_1^+}(k) + \mu_{r_2^-}(k) + \mu_{r_3^0}(k)}{3} \quad \Rightarrow \quad \mu_{f_1^+} = \frac{\delta_{11}\mu_{r_1^+}(k) + \delta_{21}\mu_{r_2^-}(k) + \mu_{r_3^0}(k)}{\delta_{11} + \delta_{21} + 1}$$

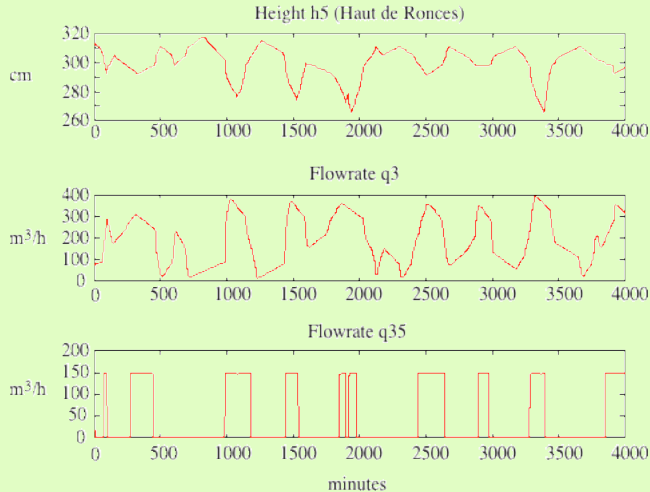
Application : urban water supply network



Application : urban water supply network



Measurements



- ◆ Water level of the tanks
- ◆ Flowrate
- ◆ State of the pumps
- ◆ Pressure

Application : urban water supply network

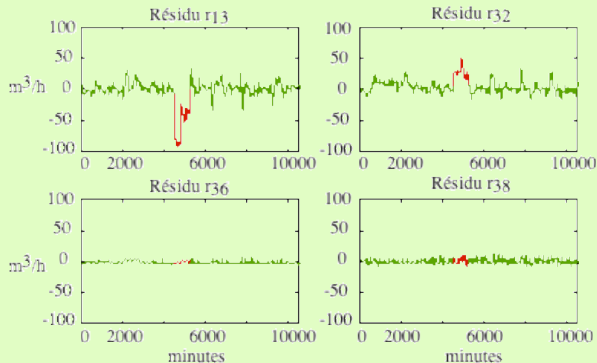
Set of residuals

$$r_{13} = \mathbf{K}_1(-q_{39}, -q_{40}, -q_{41}, -q_{42}, +q_{44})$$

$$r_{32} = \mathbf{K}_2(+q_{39}, -q_{40})$$

$$r_{36} = \mathbf{K}_3(+q_{40}, -q_{41})$$

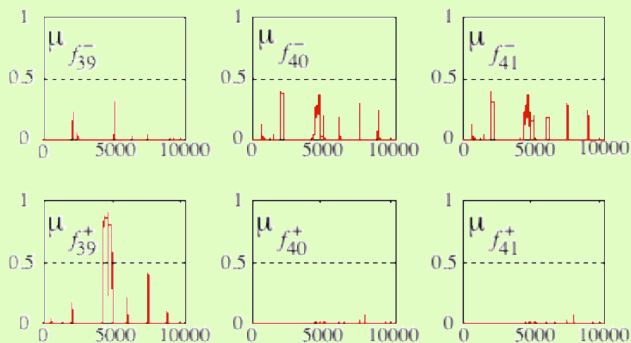
$$r_{38} = \mathbf{K}_4(+q_{41}, -q_{42})$$



➡ The measurement of q_{39} is strongly suspected

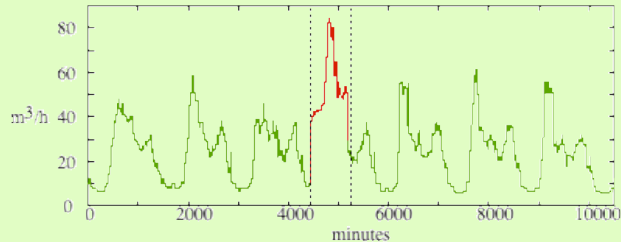
Application : urban water supply network

Truth degrees of fault hypotheses



Application : urban water supply network

Temporal evolution of the flowrate q_{39}



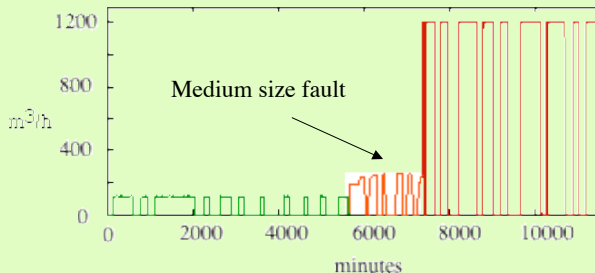
A posteriori analysis



Leak during about 12 hours

Application : urban water supply network

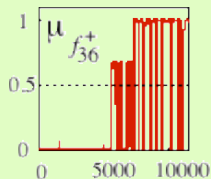
Importance of the integration of residual sensitivity to the different faults



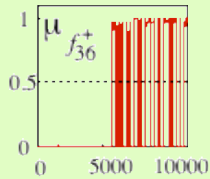
Objective : detection-localization of the fault as soon as possible

Application : urban water supply network

Truth degrees of fault hypotheses



without



with

taking into account the sensitivity of the residuals



Early detection of small magnitude fault

Conclusion

- ◆ Enhancement of now classical approach of fuzzy evaluation of residuals
- ◆ Flexible method : ability to integrate many type of information (magnitude of residual deviation, persistence index, sensitivity, and so on)
- ◆ Incremental changes in the plant state results in incremental changes in degrees of belief of fault hypotheses
- ◆ Ranking of probable faults
- ◆ Early detection of small magnitude faults