




# Quality control for quantitative PCR based on amplification compatibility test

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Methods 50 (2010) 308–312



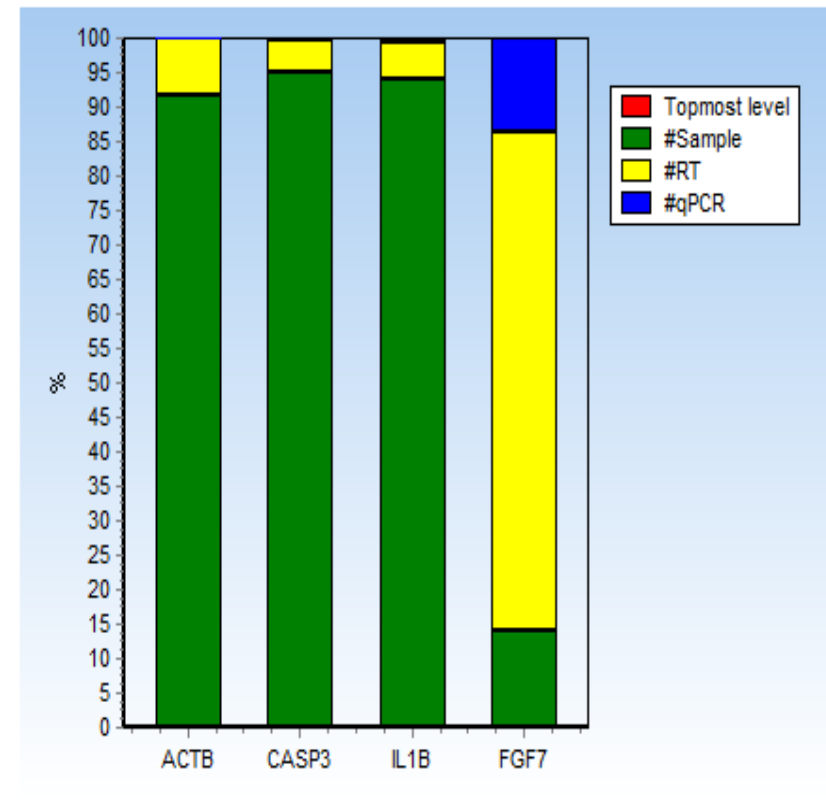
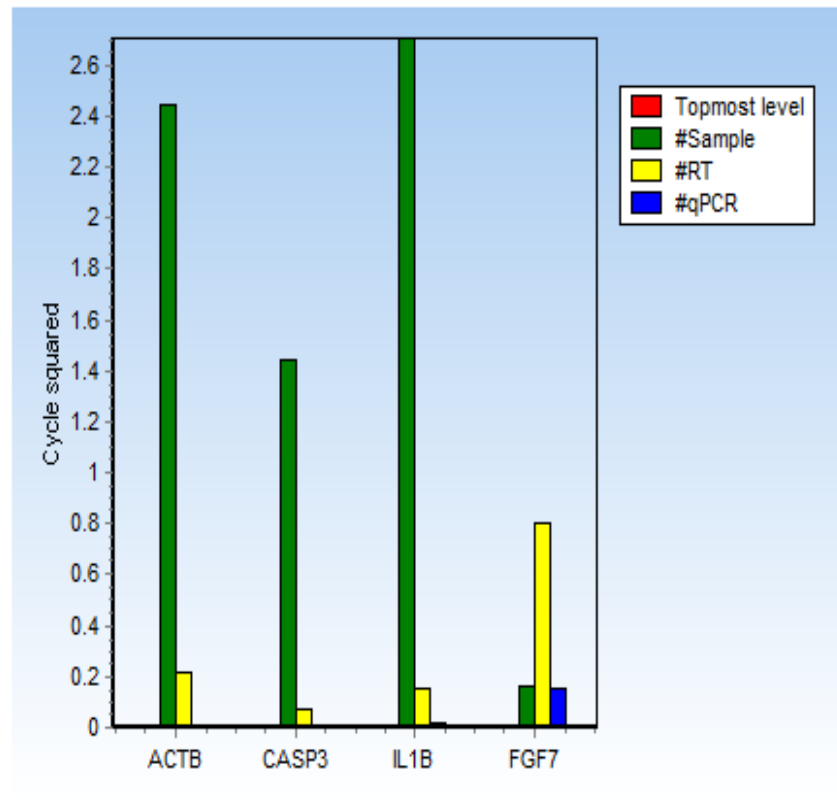
# Error stratification throughout preanalytics

tissue		liver				blood				cell culture			single cell		
gene		ACTB	IL1B	CASP3	FGF7	ACTB	IL1B	CASP3	IFNG	ACTB	H3	IL8	BCLR	18S	
Mean Cq		20.41	26.76	27.25	31.52	16.05	17.6	24.71	32.2	15.87	20.1	23.4	28.5	29.95	
SD (cycles)	I.S. var.	Subject	0.00	0.00	0.00	0.00	0.07	0.94	0.00	0.95	0.00	0.00	0.00	0.00	
	Processing noise	Sampling	1.56	1.64	1.20	0.40	0.10	0.00	0.11	0.00	0.37	0.20	0.29	0.20	1.90
		RT	0.46	0.39	0.27	0.90	0.21	0.32	0.18	0.24	0.35	0.35	0.31	0.21	0.30
		qPCR	0.07	0.12	0.08	0.39	0.18	0.20	0.13	0.40	0.21	0.10	0.09	0.16	0.51
	Total noise		1.63	1.70	1.23	1.06	0.31	1.01	0.25	1.06	0.55	0.42	0.44	0.33	1.99

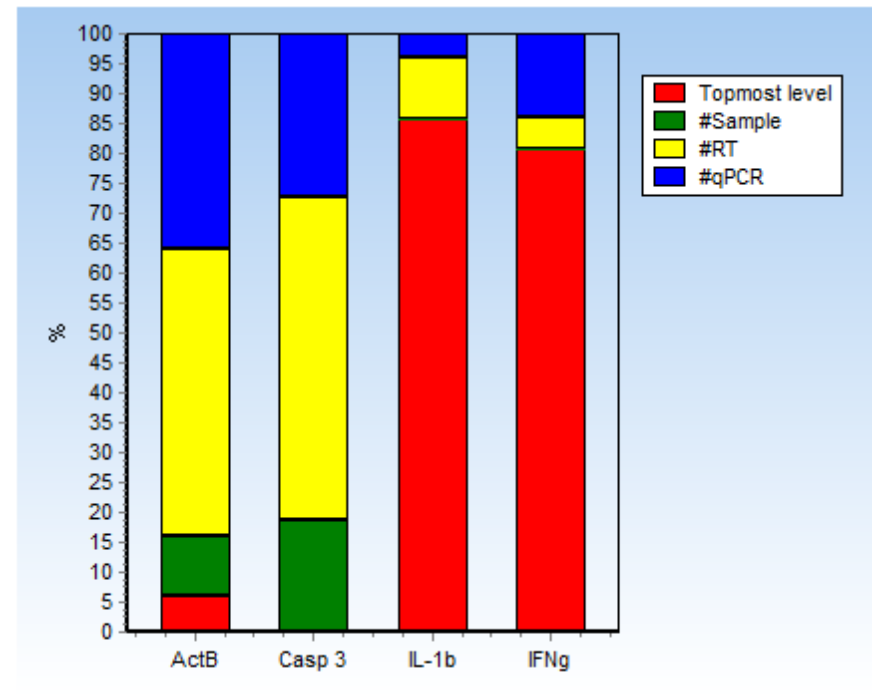
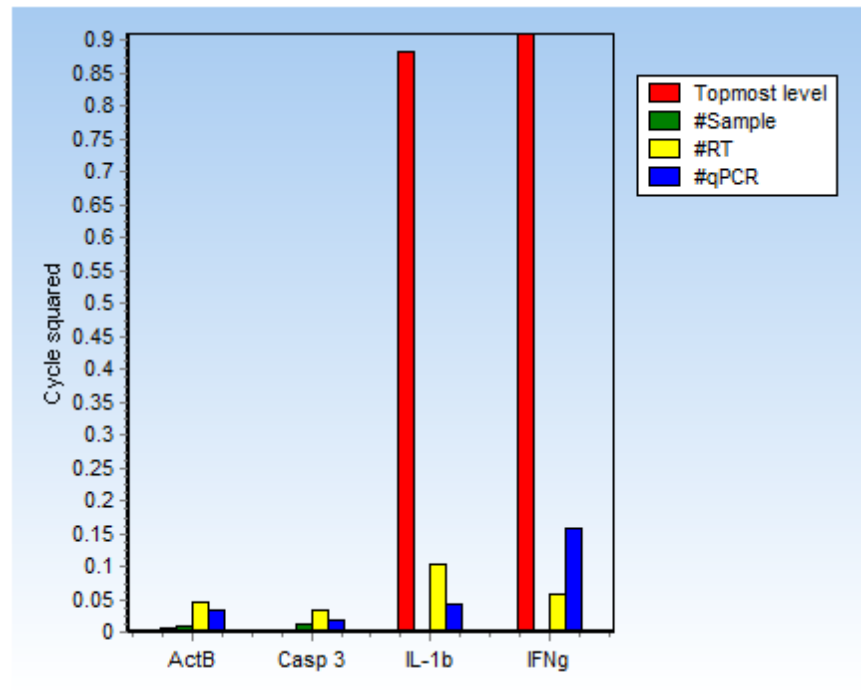
  

~1.5	~0.66	~0.44	~2
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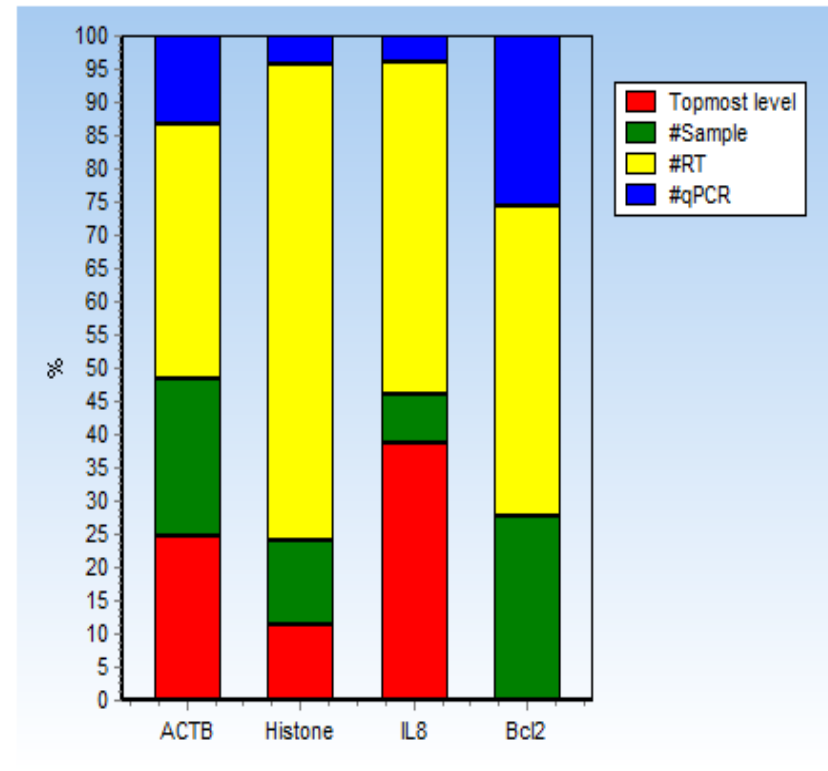
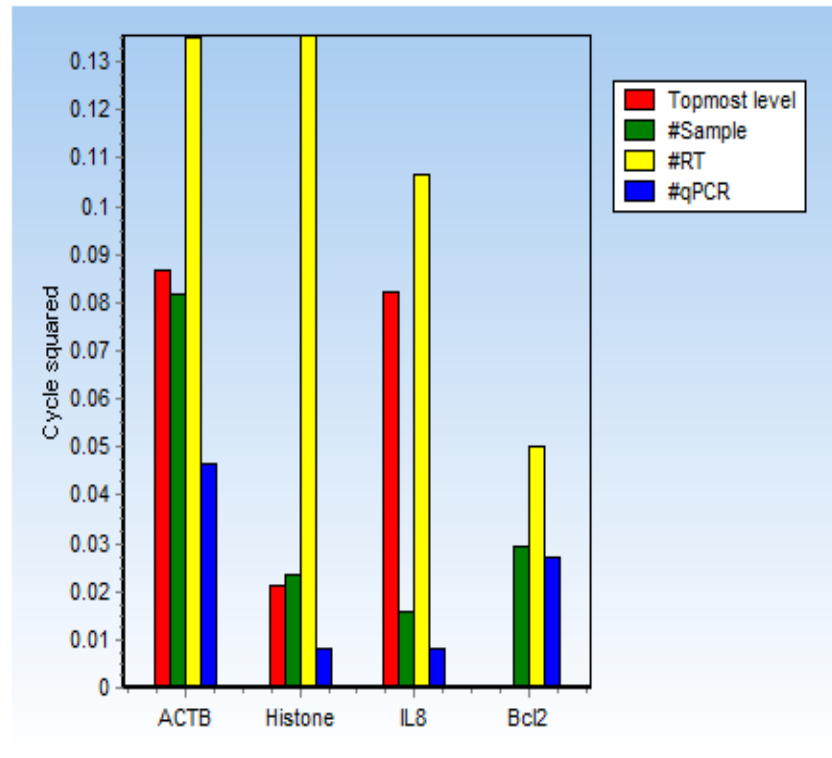
# Liver tissue



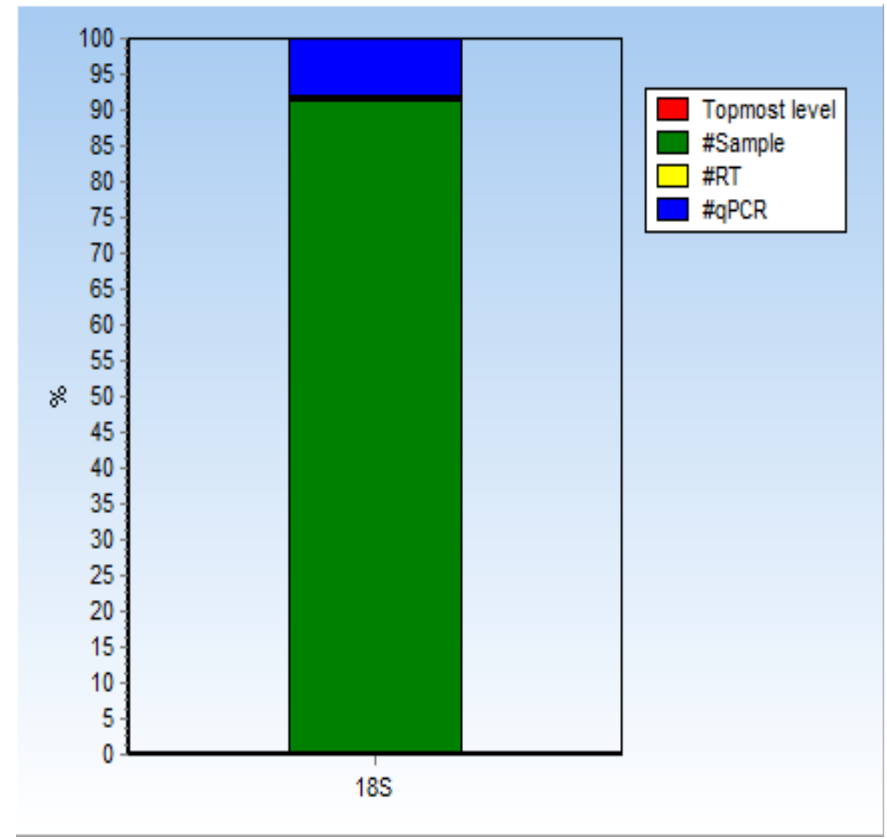
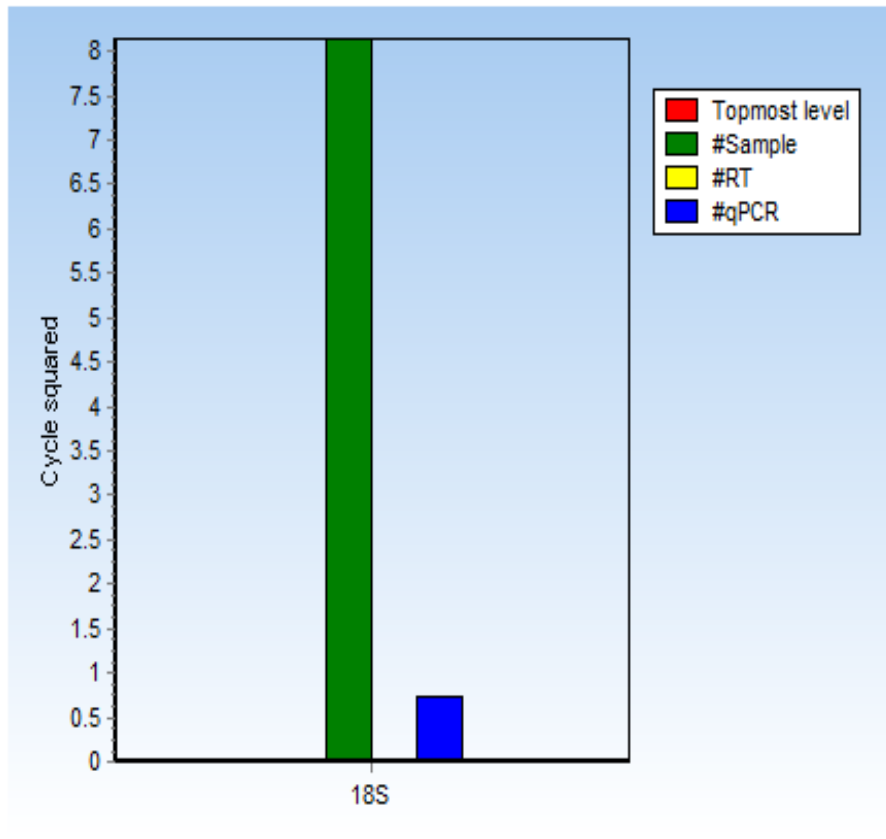
# Blood samples



# Cell culture

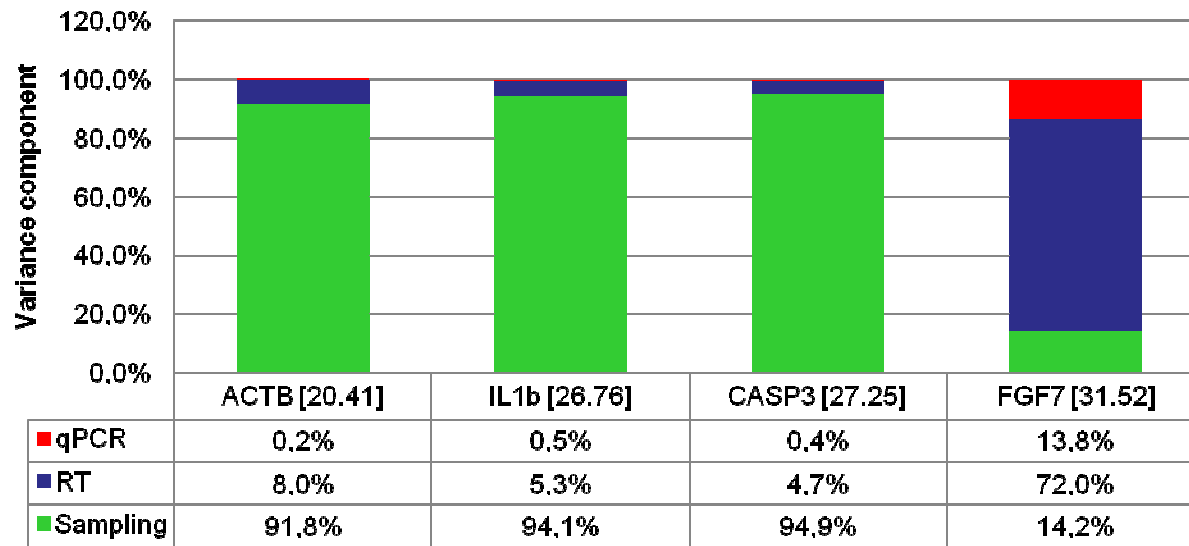


# Single cell

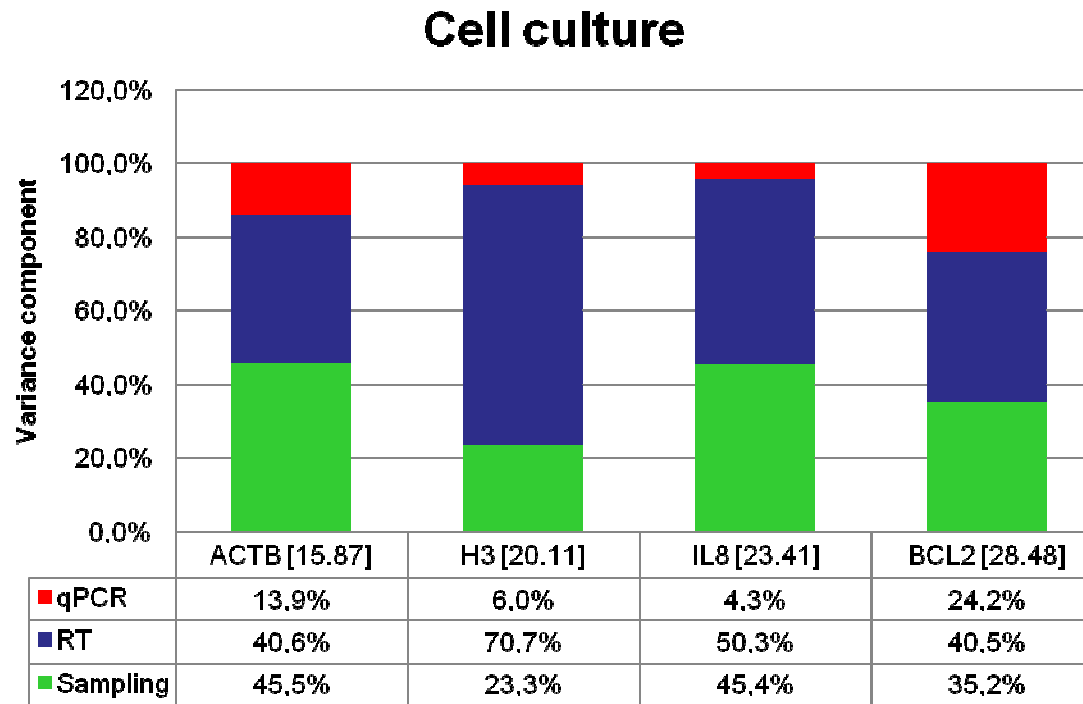


# Noise contribution by various sample processing steps

## Liver

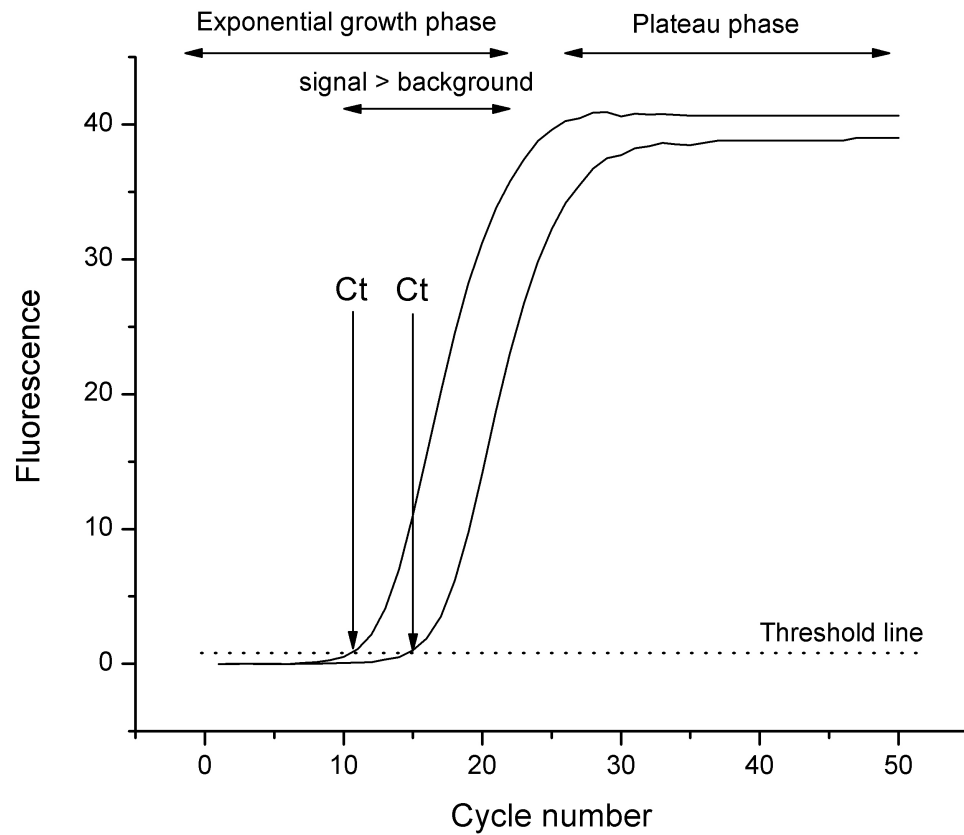



# Noise contribution by various sample processing steps





# Real-time PCR response curve - Cq values






If a biological sample is inhibited, technical replicates  
WILL NOT protect us from the error

Any difference in the  $C_q$  between different samples may  
be due to a biological effect or due to INHIBITION!!!

Therefore,  $C_q$  is not suitable as a quality control measure

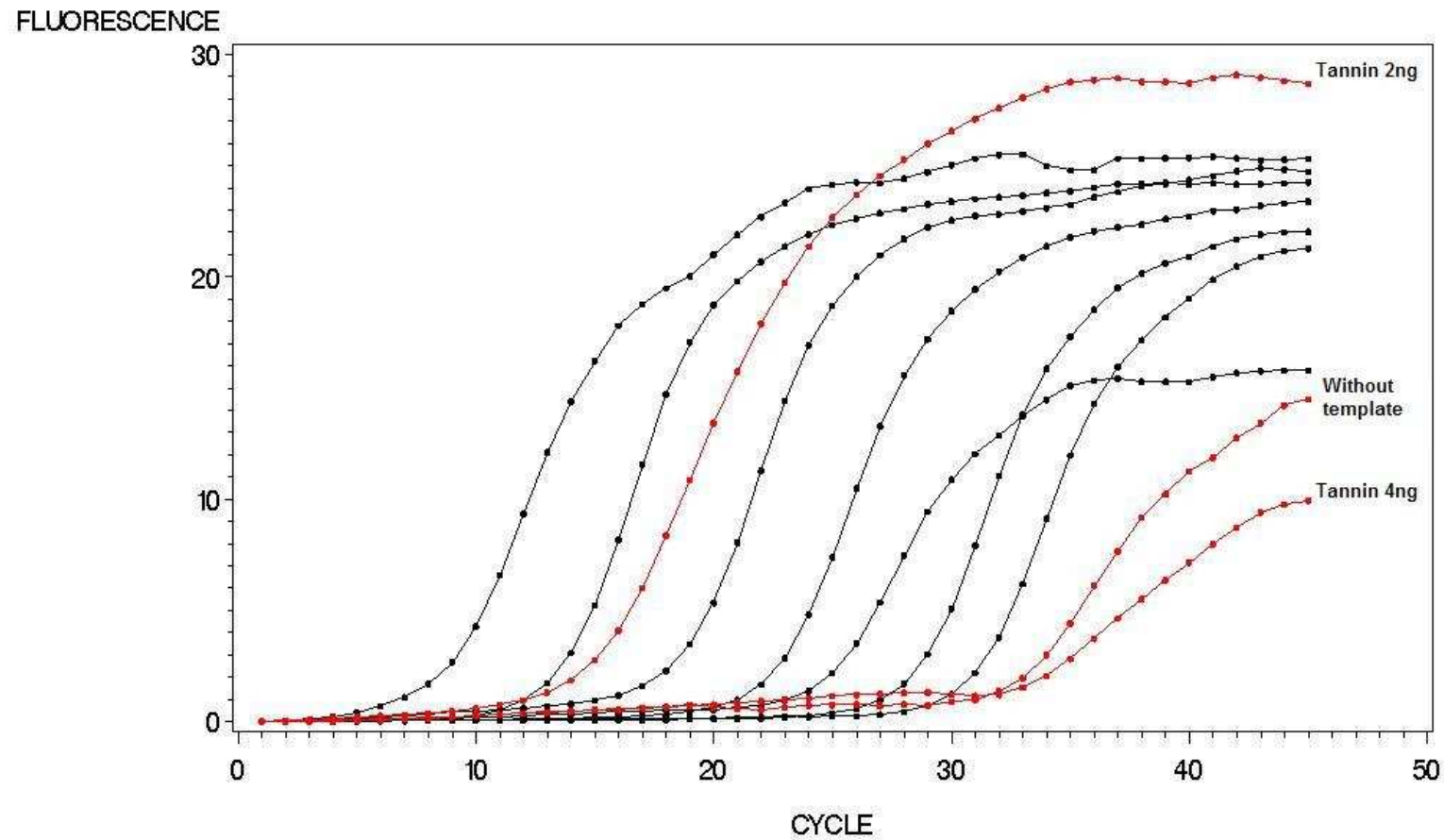
Kinetics of the reactions is much more reliable

Because kinetics must be compatible among samples,  
regardless of the initial DNA concentration



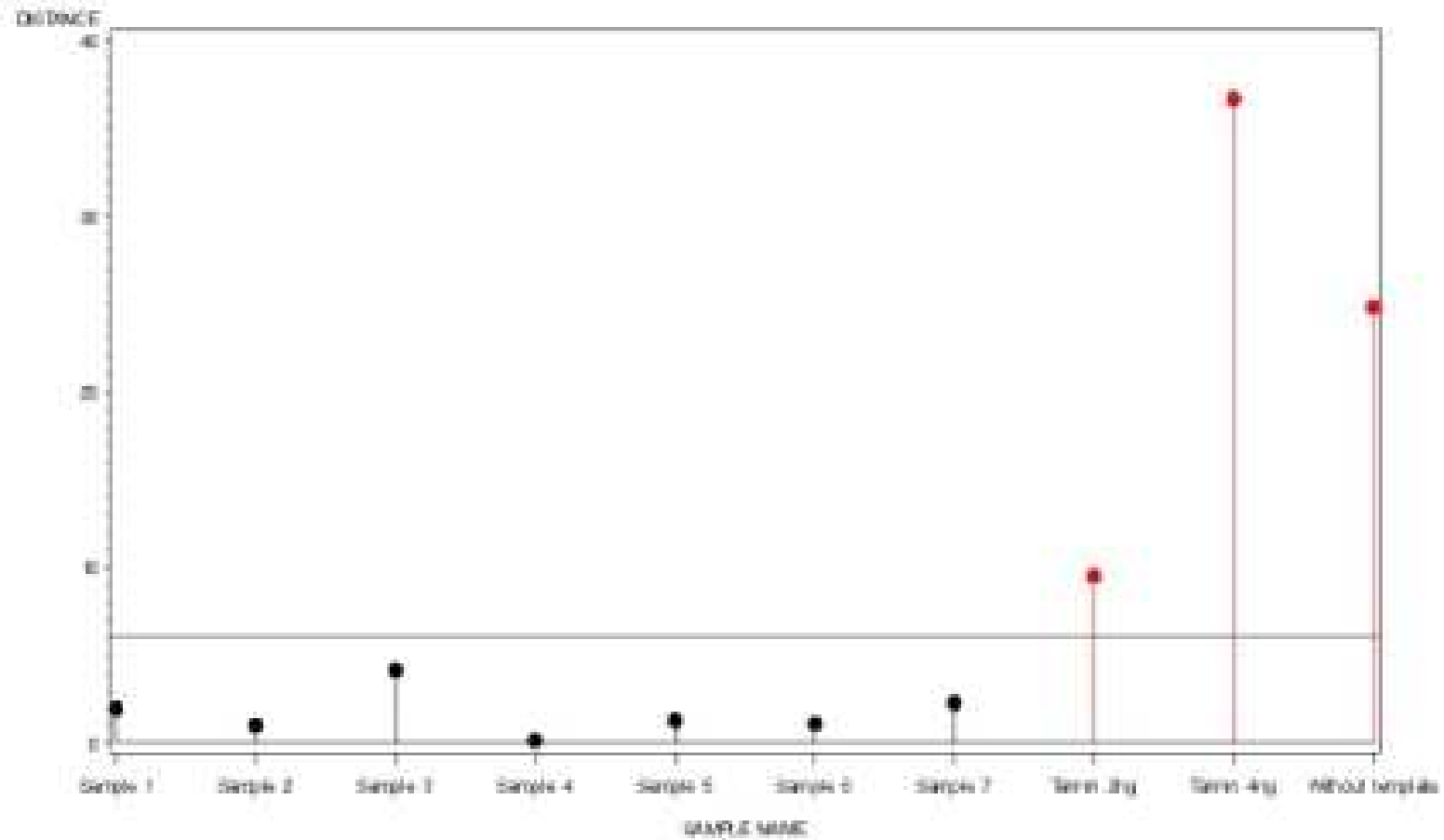
# Amplification kinetics

example of incompatible samples

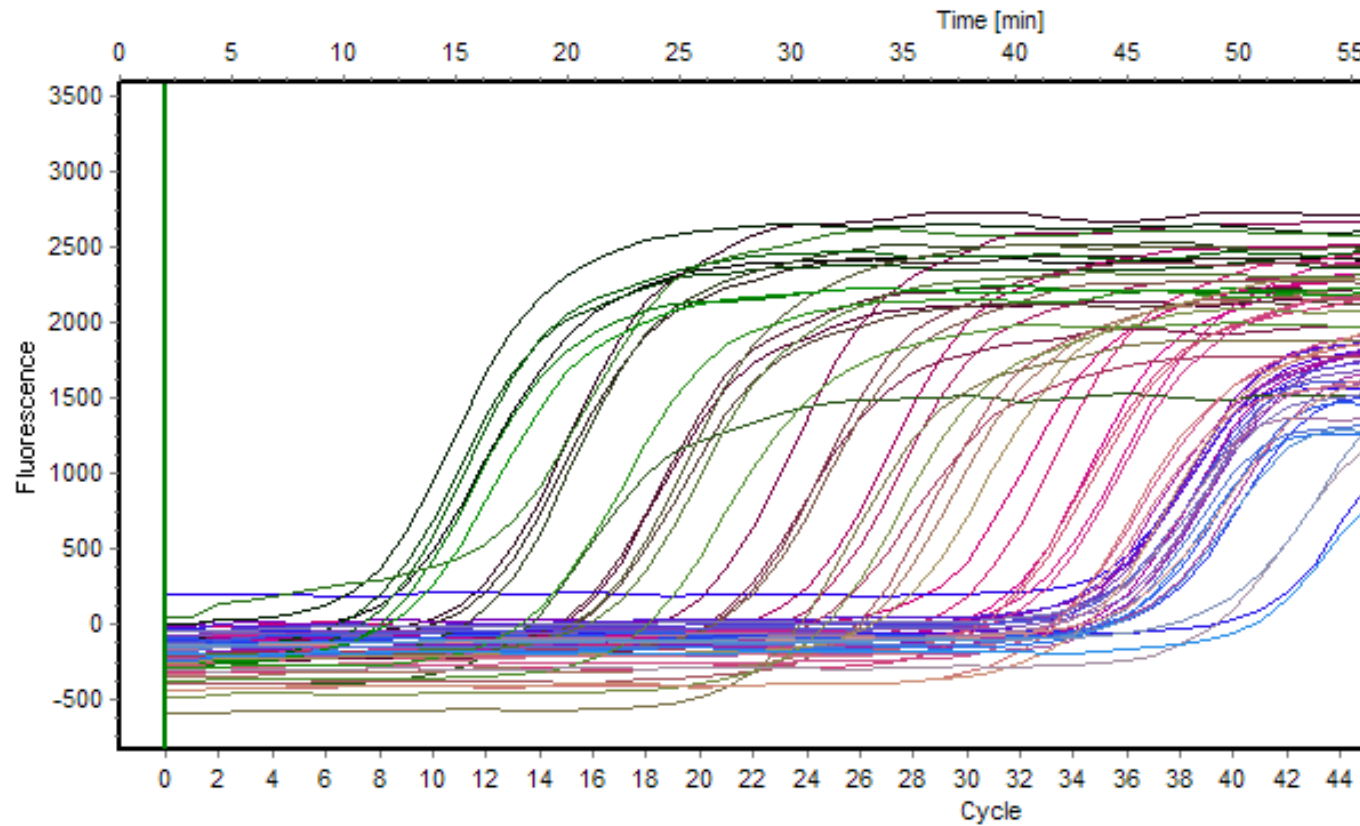


# The multivariate distance from the centre of the reference set

Multivariate distance of amplification kinetics from reference



## Visual check may sometimes be impossible



The kinetics must be digitalised and the obtained parameters compared statistically.

# Discrepancy between methods for amplification efficiency estimation from single sample

Comparison with E obtained from standard curve

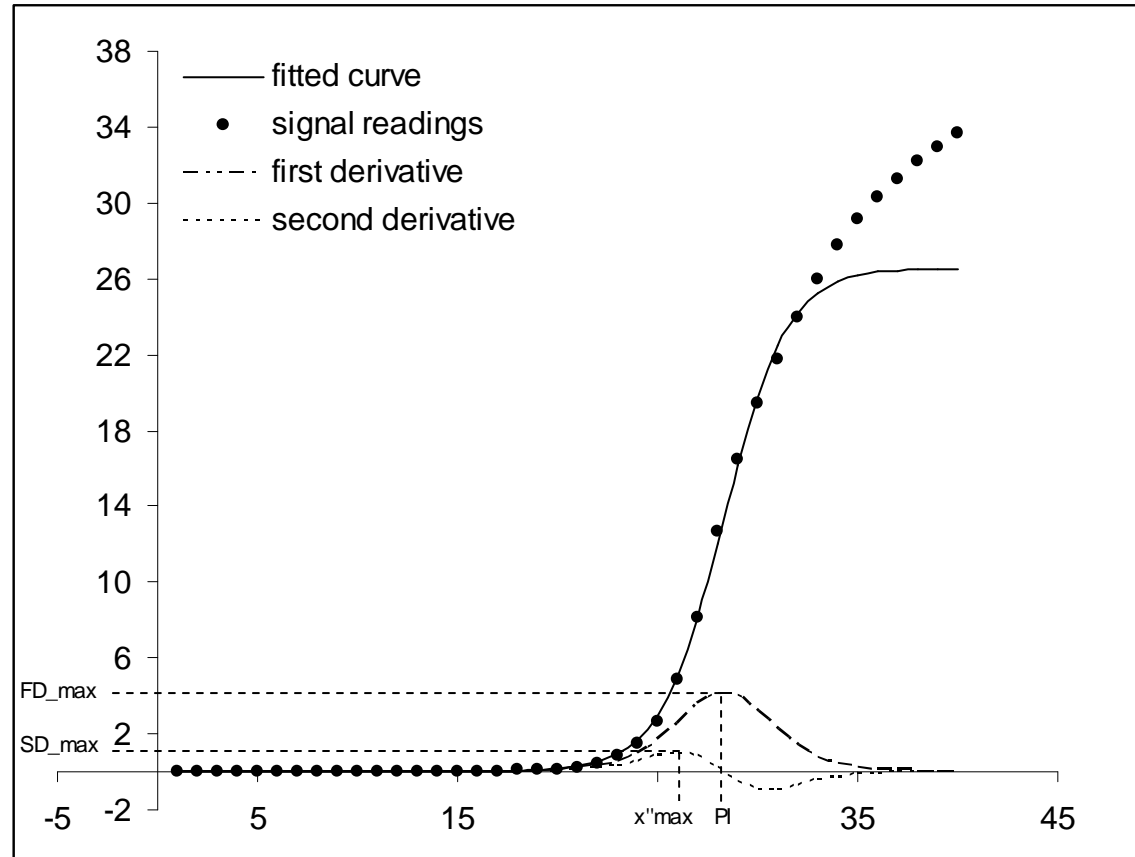
<b>Tichopad et al.</b>		<b>Ramakers et al.</b>		<b>Peirson et al.</b>		<b>Wilhelm et al.</b>		<b>Liu &amp; Saint</b>	
$\Delta E$	SD	$\Delta E$	SD	$\Delta E$	SD	$\Delta E$	SD	$\Delta E$	SD
0.44	0.076	0.26	0.102	0.24	0.118	0.31	0.076	0.33	0.071

$$E_{\text{std}} = 10^{-1/\text{slope} - 1}$$

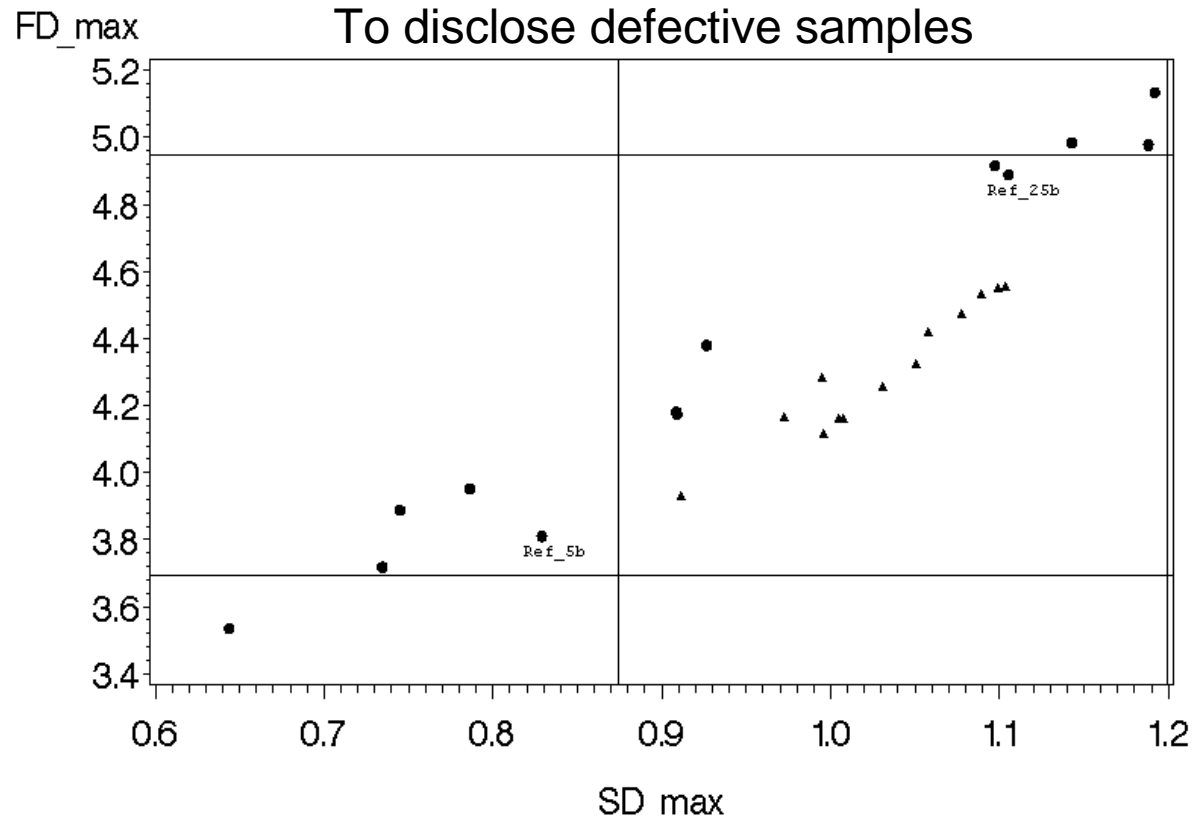
$$\Delta E = E_{\text{std}} - \bar{E}_{\text{individual}}$$

# Kinetics parameters for amplification outlier detection

Maximum of the first [FD\_max] and second derivative [SD\_max] are used to identify amplification kinetics in 2D space



# Multivariate outlier detection



Test samples ● vs. reference set ▲. Flagged points were excluded from the reference set. The inner lines define traditional univariate boundaries for outliers obtained as upper quartile plus 1.5 times interquartile range and lower quartile minus 1.5 times interquartile range.






## Validation experiments

### EXPERIMENT 1: One assay varying inhibition strength

3 x 5 serial dilutions were produced as non-inhibited reference set (n=15) and inhibited sets (each n=15) with 1%, 2%, 4%, 8%, and 16% of primer competitors added to regular primer concentration. **Primer competitors** were used to introduce the inhibition.

### EXPERIMENT 2: Three assays constant inhibition strength

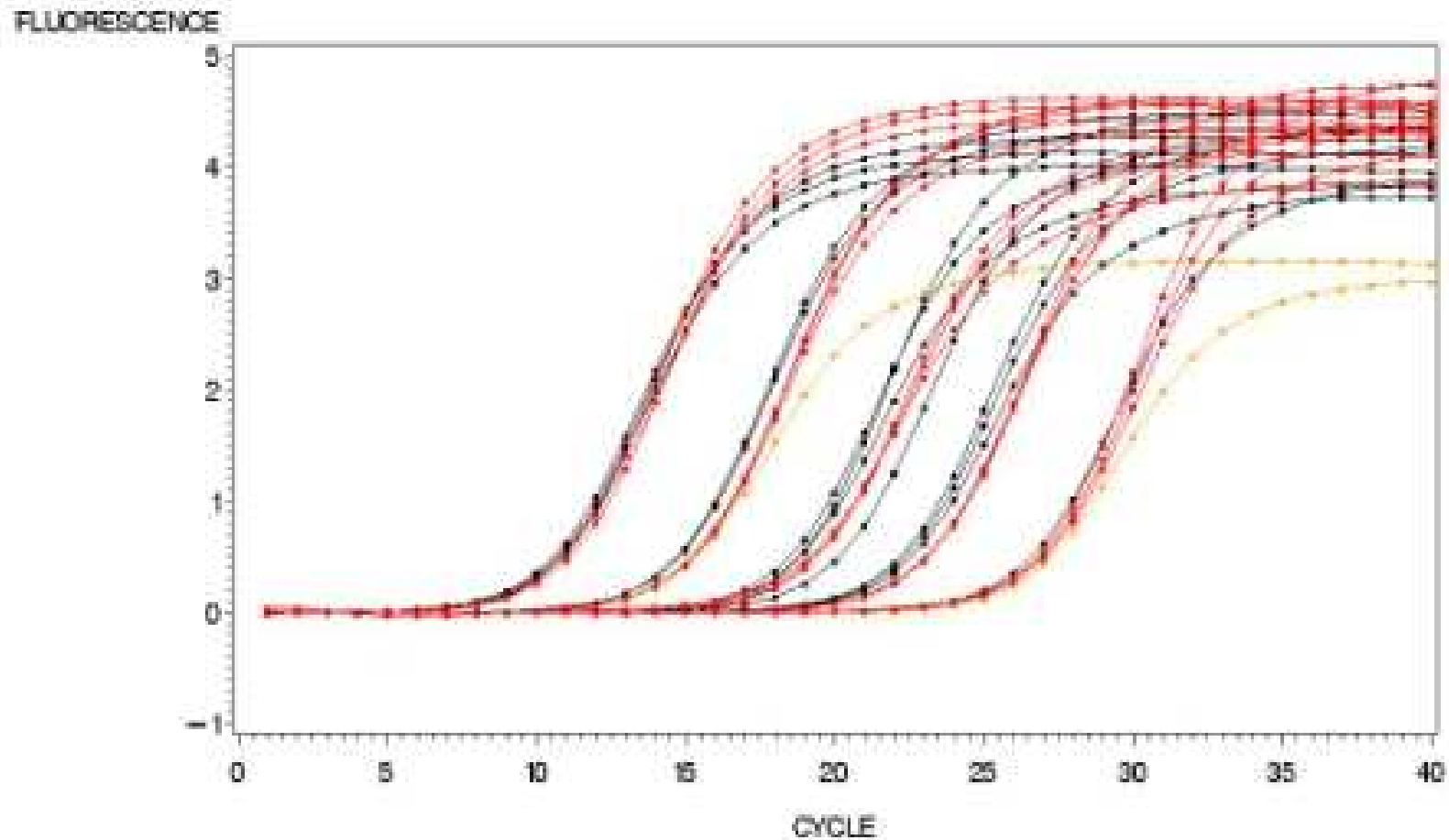
Three assays as standard curves were performed. Each standard curve consisted of 5-fold dilutions (1-, 5-, 25-, 125-, and 625-fold) in triplicates (total 15 reactions). Two standard curves were produced from the same cDNA stock solution, one without inhibitor and one with 2.0 ng **tannic acid** added per 15  $\mu$ l reaction mix.



# EXPERIMENT 1

Effect of the inhibition by **primer competitors** on the C<sub>q</sub> value

Resolution of amplification kinetics outliers



# EXPERIMENT 1

Effect of the inhibition by **primer competitors** on the Cq value

	<b>Differences from reference [<math>\Delta Cq</math>] for various inhibition strengths</b>				
<b>DNA conc.</b>	<b>1%</b>	<b>2%</b>	<b>4%</b>	<b>8%</b>	<b>16%</b>
x*10000 (n=3)	0.05	-0.29	-0.223	-0.257	-0.363
x*1000 (n=3)	0.233	0.327	0.143	-0.077	-0.307
x*100 (n=3)	0.213	0.017	-0.073	-0.303	-0.47
x*10 (n=3)	-0.23	-0.173	-0.457	-0.753	-0.737
x (n=3)	NA	NA	NA	NA	NA
<b>p of t-test (H0: Dif&lt;0)</b>	<b>0.58</b>	<b>0.84</b>	<b>0.31</b>	<b>0.09</b>	<b>0.02</b>

NA – too large scatter of the reference to reliably calculate the  $\Delta Cq$ .

# EXPERIMENT 1

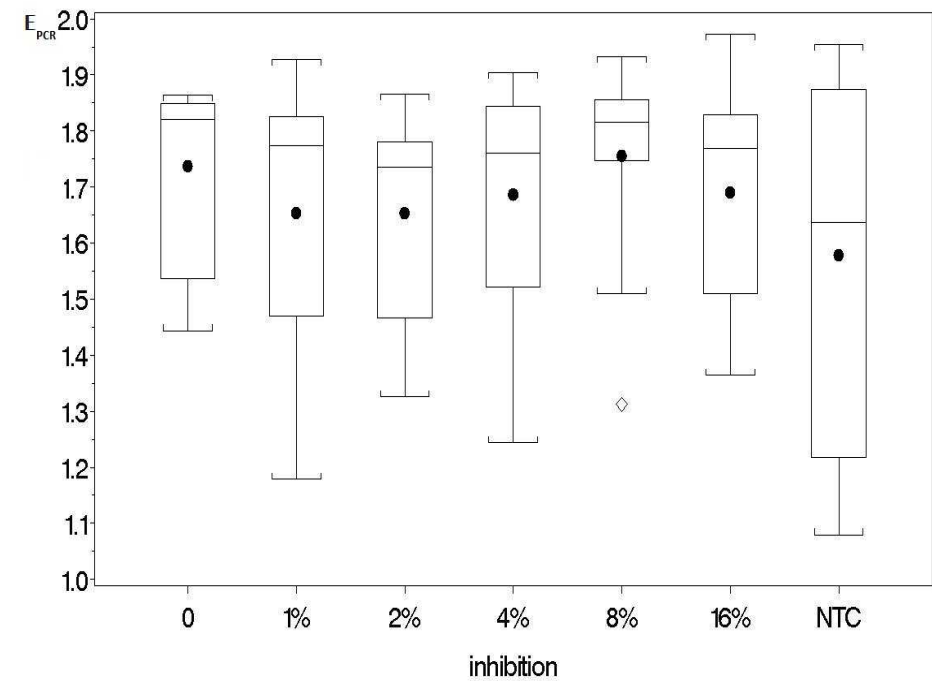
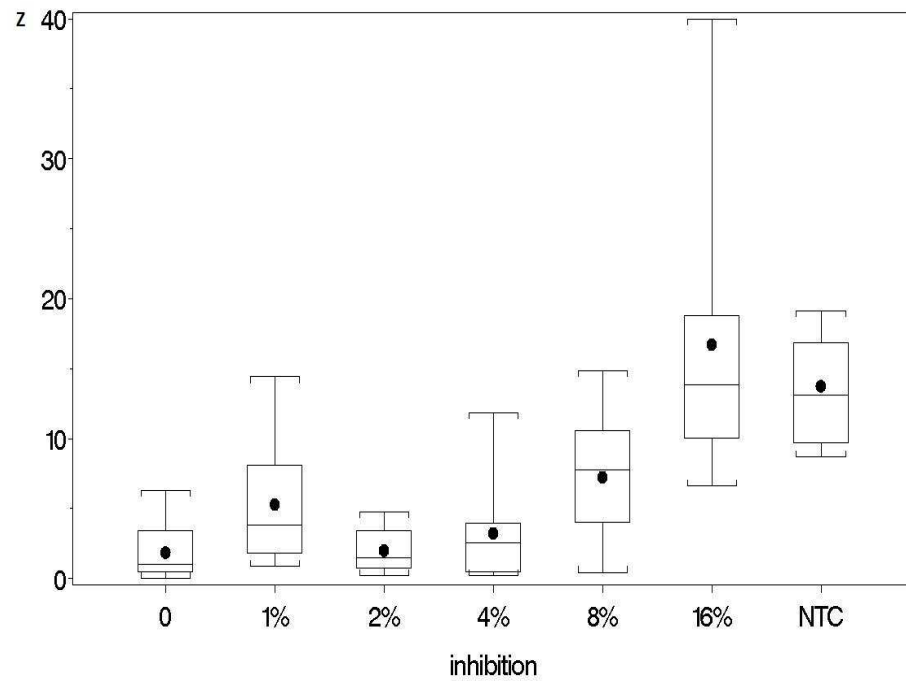
Retrieval of samples inhibited by **primer competitors** by the multivariate vs. univariate test

<b>Multivariate (Z)</b>	<b>1%</b>	<b>2%</b>	<b>4%</b>	<b>8%</b>	<b>16%</b>	<b>NTC</b>
N/Total	6/15	2/15	2/15	11/15	15/15	6/6
Retrieval [%]	40%	13%	13%	73%	<b>100%</b>	<b>100%</b>
<b>Univariate (E)</b>						
N/Total	4/15	5/15	2/15	1/15	2/15	2/6
Retrieval [%]	27%	33%	13%	7%	13%	13%
<i>Bar et al (2003)</i>						

*Bar T, Stahlberg A, Muszta A, Kubista M. (2003). Nucleic Acids Res. 31, e105*

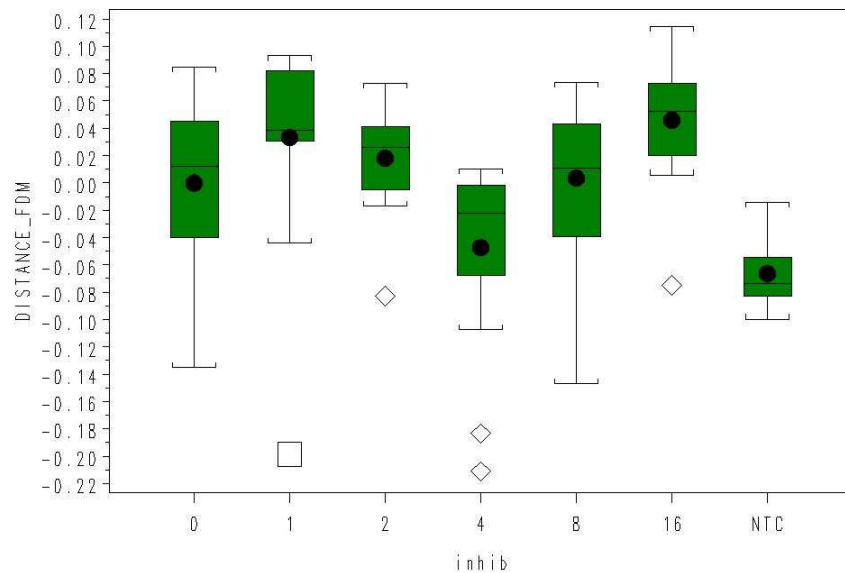
# EXPERIMENT 1

Retrieval of samples inhibited by **primer competitors** by the multivariate vs. univariate test

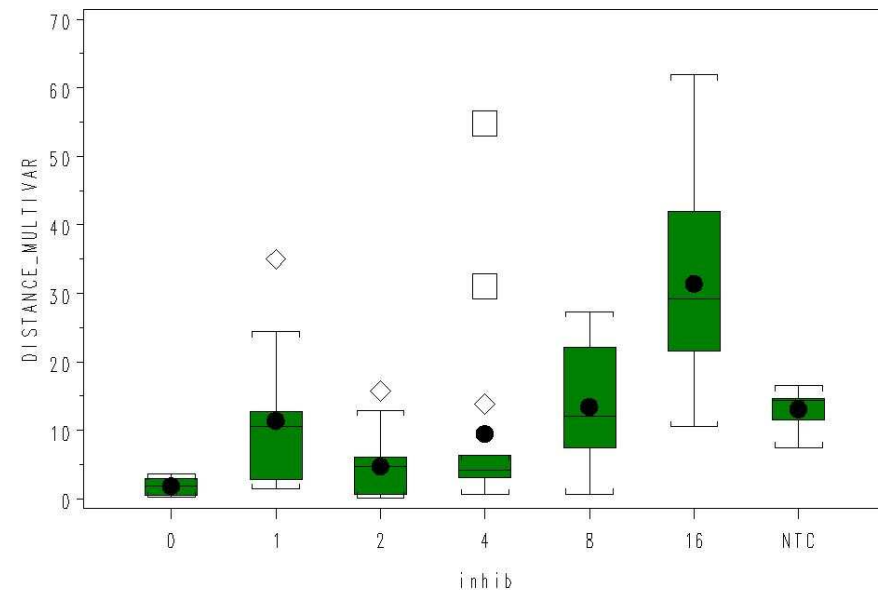


*Bar T, Stahlberg A, Muszta A, Kubista M. (2003). Nucleic Acids Res. 31, e105*

# One parameter vs. two parameters in detecting kinetics outliers



*Maximum of the first derivative (FDM)*



*Multivariate Mahalanobis DISTANCE calculated from the maximum of the first derivative (FDM) and the maximum of the second derivative (SDM)*



## EXPERIMENT 2

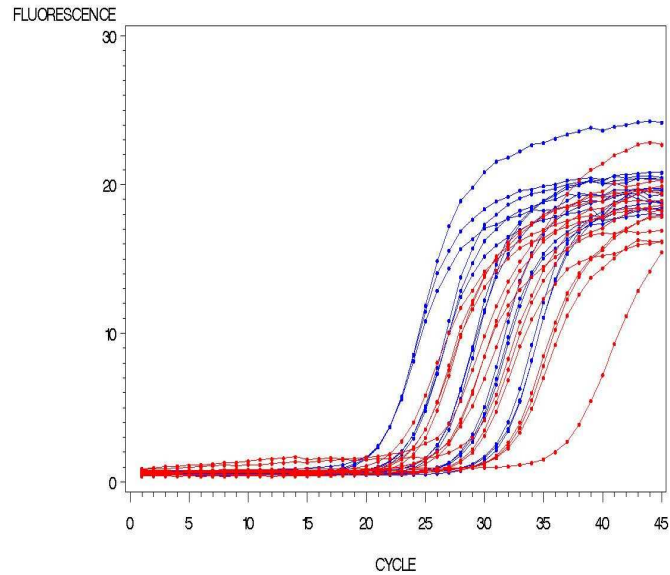
Retrieval of samples inhibited by **tannic acid** by the multivariate vs. univariate test

	<b>ACTB</b>	<b>H3</b>	<b>IGF</b>
<b>Multivariate (Z)</b>			
N/Total	12/15	15/15	10/15
Retrieval [%]	80%	100%	67%
<b>Univariate (E)</b>			
N/Total	1/15	5/15	2/15
Retrieval [%]	7%	33%	13%

*Bar T, Stahlberg A, Muszta A, Kubista M. (2003). Nucleic Acids Res. 31, e105*



# Multivariate KOD using Kineret software



Well: A1

	1	2	3	4	5	6	7	8	9	10	11	12
ref	17.86	17.6	18.15	19.86	19.65	19.95	22.58	22.52				
A	4.823598	0.50029	2.358282	0.517989	2.25635	5.864101	0.342406	5.653175				
B	22.31	23.1	24.77	25.19	27.38	27.58	28					
	1.34918	1.045277	0.308707	1.428269	0.594126	0.355106	0.103168					
C	23.17	19.43	33.81	20.77	20.8	20.57	23.31	23.45				
	218.485496	42.977114	244.932475	4.652614	15.751297	5.888475	19.680594	17.800308				
D	24.3	25.68	25.65	27.06	28.68	29.02	28.34					
	10.065538	23.439626	21.708932	2.385635	18.848206	37.8721	17.381653					

Max Ref Iterations: 3  include calib samples  only inhibited samples

15 wells

ref no ref

[www.labonnet.com](http://www.labonnet.com)



## Calculation

*Assuming that  $n$  variables ( $X_1, \dots, X_n$ ) are independent, approximately normally distributed Z-score can be calculated:*

$$Z = X_1^2 + \dots + X_n^2$$

*where  $Z$  is approximately  $\chi^2$  (chi-square) distributed with  $n$  degrees of freedom*

***Problem:**  $SD\_max$  and  $FD\_max$  are correlated*

$$FD\_max = SD\_max * b + a + \tau$$

*Where  $a$  and  $b$  are the linear coefficients and  $\tau$  is the residual error from the predicted regression line.*

$$\tau = FD\_max - \widehat{FD\_max}$$

*The final Z-score:  $Z = SD\_max^2 + \dots + \tau^2$*

*Critical values for the 95% and 99% percentily of the  $\chi^2$  distribution for 2 df are 5.991 and 9.210, respectively.*



## Use of Kineret within SPIDIA

**Objective:** amplification compatibility as an additional RNA quality

**Kineret Version 1.0.5 was used**

**The reference set:** samples REFpool RNA + REF RNA from all the participating laboratories.

The Z score (called Kinetics Distance – KD) of the three qPCR technical replicates of each sample were averaged.

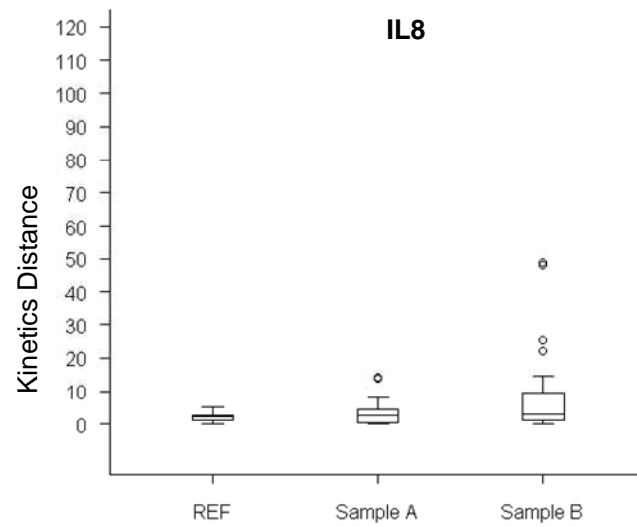
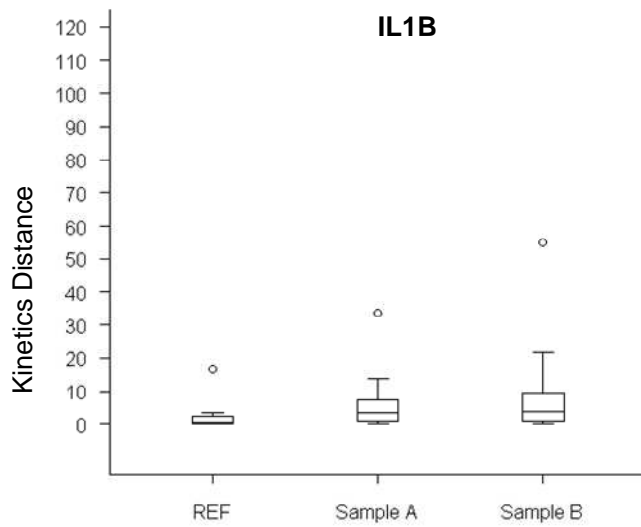
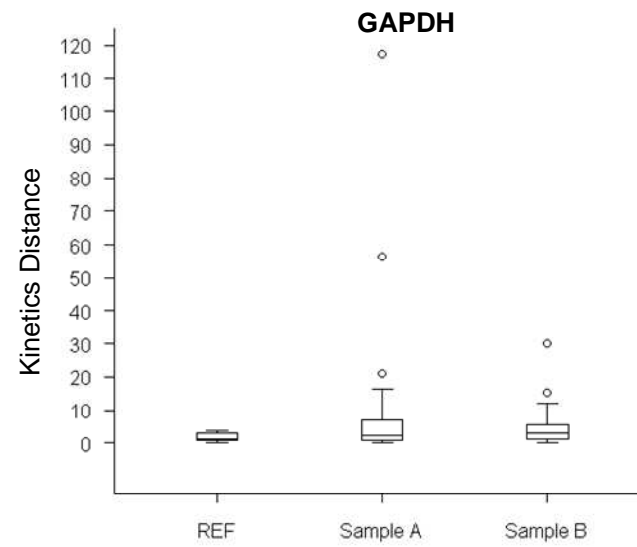
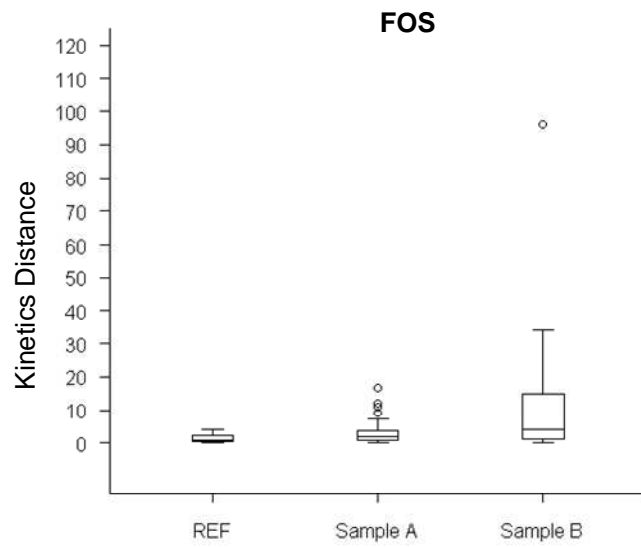
**The test set:** RNA from samples A and B were compared with the reference set

KDs of each group are presented in box-whisker plots



**KD distribution as calculated by the Kineret software of the four gene transcripts in each sample**

Gene	Sample	N	min	median	max	IQR
FOS	Sample A	10	0.0	2.0	16.9	3.2
	Sample B	9	0.1	4.3	96.1	14.5
	REF	8	0.0	0.8	4.1	1.8
GAPDH	Sample A	9	0.0	2.4	117.5	6.4
	Sample B	9	0.3	2.9	30.0	4.4
	REF	8	0.1	1.2	3.9	2.2
IL1B	Sample A	10	0.2	3.2	33.8	6.7
	Sample B	9	0.1	3.7	55.1	8.6
	REF	8	0.2	0.7	16.9	2.1
IL8	Sample A	10	0.1	2.6	14.3	3.8
	Sample B	9	0.1	3.2	48.8	8.2
	REF	8	0.2	2.1	5.1	1.7

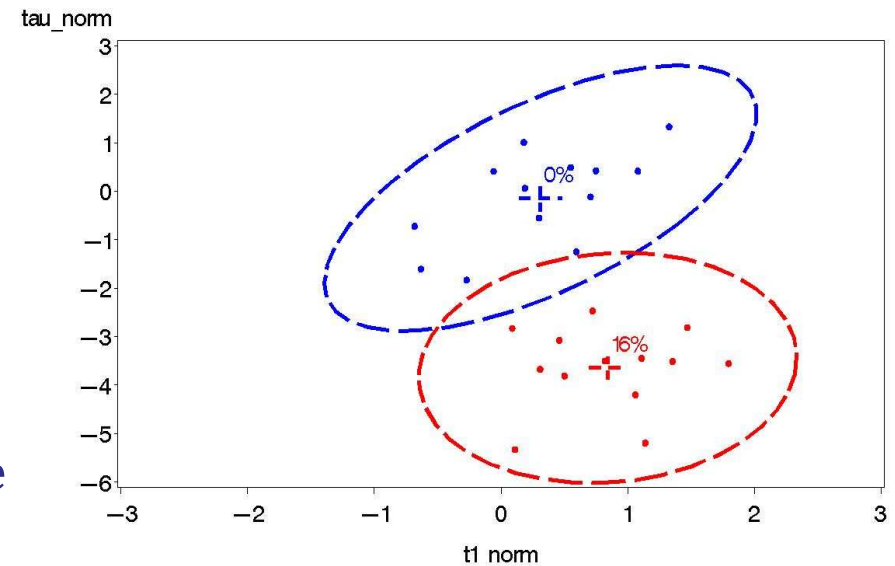


# Conclusion

**Generally, multivariate methods perform better in separating defective reactions than univariate methods.**

Several methods can be used; e.g. the Mahalanobis distance is the uncorrected sum of squares of the principal component scores calculated from the center of the reference data set.

Also other multivariate approaches may be employed such as the Kohonen self-organising networks, K-means or support vector machines.





## Acknowledgements

Financial grants were obtained from:

- European Community seventh framework project SPIDIA ([www.spidia.eu](http://www.spidia.eu)) Grant Agreement N°: **222916**
- European Community sixth framework project SmartHEALTH ([www.smarthealthip.com](http://www.smarthealthip.com)) Grant Agreement N°: **016817**
- National R&D incubator program of Ministry of Industry and Trade of the State of Israel

Original paper available in *Methods* 50 (2010) 308–312

