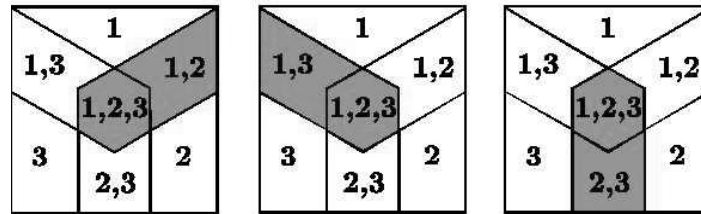


MCP2002 Bethesda

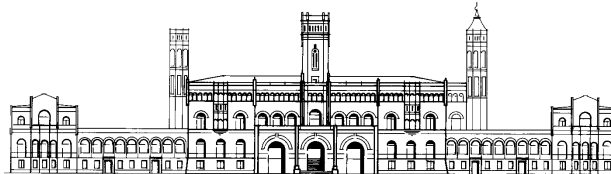


Demonstration of interlaboratory similarity of dose-response assays by modified interaction contrasts

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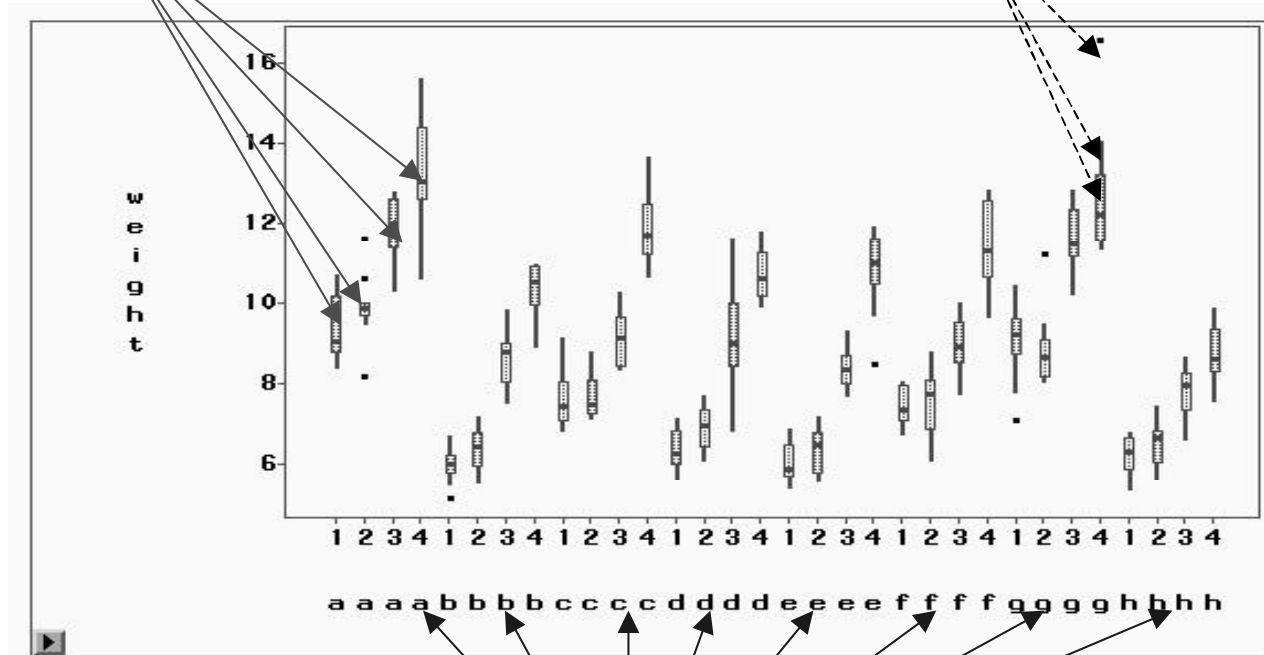
1. A toxicological example

- Validation process of new tox-assays:
demonstrating similar sensitivity in several laboratories
the majority of non-toxic chemicals \Rightarrow -
the majority of toxic chemicals \Rightarrow +
in all labs, i.e. no qualitative interaction
- Common design [**C**, **D**₁,...,**D**_k]
- Assay similarity= **similarity of the dose-response curves**, or at least similarity of *increments versus C* in all labs, i.e. **no quantitative interaction**

Example: HCB immunotox study (Schulte et al., 2002), liver weight

doses

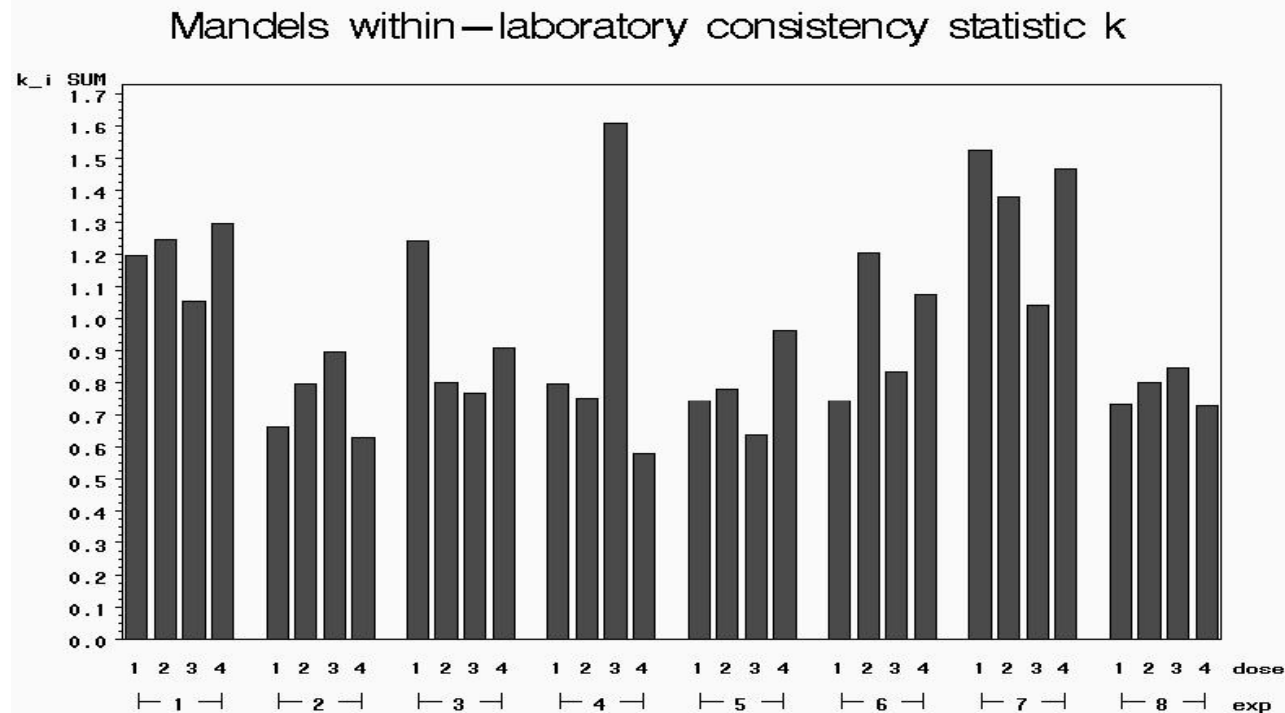
individuals

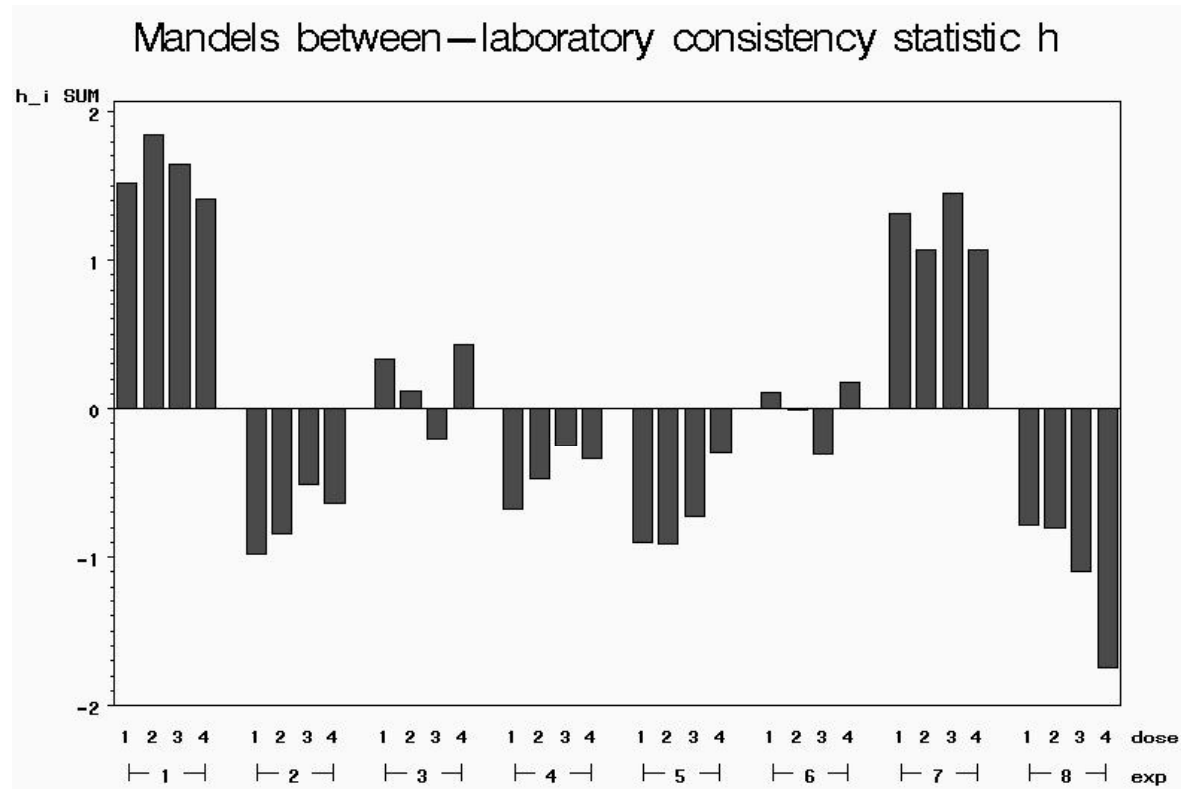


labs

2. Common approaches of interlaboratory comparisons

Recommendation: Estimation of intra- and interlaboratory variance, typically as Mandel plots (ASTM Committee E-11 on Statistical Methods, 1993)



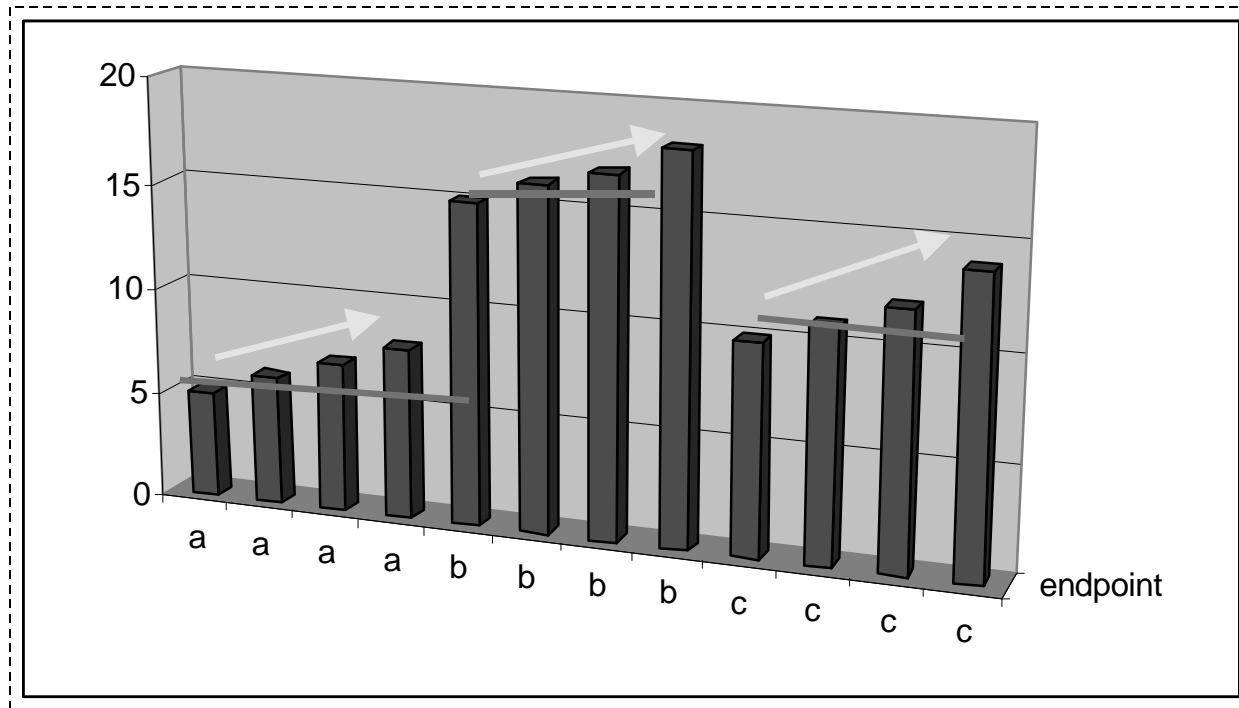


However: All toxicological studies would fail these criteria of reproducibility \Rightarrow directed on all absolute values

3. Interlaboratory study in toxicology

Same dose-response

Different absolute values



Show similarity of dose-response curves over labs
= similarity of effect sizes, but not similarity of the
absolute values

4. Interaction contrasts

I) Testing interaction in two-way layout: DOSE x LAB
common by F-test. Global test only; no confidence intervals

II) Demonstrating similarity between labs

Similarity \Rightarrow equivalence of selected interaction
contrasts \Rightarrow TOST; but a-priori no equivalence margins
known \Rightarrow estimation of **(1-2 α) confidence intervals**
(Schuirmann, 1987).

III) Tetrad pairwise interaction contrasts

$$\frac{L(L-1)}{2} \frac{(k+1)k}{2} \text{tetrad pairwise interaction contrasts}$$

$$\max \left\{ \left| (\mu_{lj} - \mu_{lj'}) - (\mu_{l'j} - \mu_{l'j'}) \right| \right\}$$

$$l=1, \dots, L-1; l'=2, \dots, L, j=0, \dots, k-1; j'=1, \dots, k$$

Simultaneous confidence intervals:

$$\sum_{l=1}^L \sum_{i=1}^k c_{li} \mathcal{Y}_{li} \in \left[\sum_{l=1}^L \sum_{i=1}^k c_{li} \hat{\mathcal{Y}}_{li} \pm q_{1-\alpha} \sqrt{\frac{MSE}{n}} \frac{1}{2} \sum_{l=1}^L \sum_{i=1}^k |c_{li}| \right]$$

$$\mathcal{Y}_{li} = \bar{Y}_{il.} - \bar{Y}_{i..} - \bar{Y}_{.l.} + \bar{Y}_{...} \text{tetrad difference,}$$

$q_{1-\alpha}$ the quantile:

- Bradu and Gabriel (1974) Bonferroni approach
- Hochberg and Tamhane (1986) range statistics (balanced)
- Westfall et al. (1999) simulation-based (MC-sim)
- Bretz et al. (2002) any design based on the multivariate t-distribution with a related correlation structure

But all-pairs comparisons between the doses are not the experimental question \Rightarrow reduce the number of comparison to **many-to-one** between the doses only

IV) Many-to-one interaction contrasts

$\frac{L(L-1)}{2}k$ many-to-one-by-lab-interaction contrasts

$$\max \left\{ \left| (\mu_{lj} - \mu_{l0}) - (\mu_{l'j} - \mu_{l'0}) \right| \right\}$$

($l=1, \dots, L-1$; $l'=2, \dots, L$; $j=1, \dots, k$; $j=0$... control).

This UIT allows all elementary decisions, i.e. simultaneous confidence intervals (Gabriel, 1969)

$$H_0 : \bigcup_{l=1, l'=2}^L \bigcup_{j=1, j'=2}^k \left| (\mu_{lj} - \mu_{l0}) - (\mu_{l'j} - \mu_{l'0}) \right| > \delta$$

(Notice in the example with 1+3 doses and 8 labs: 168 all-pairs vs. 84 many-to-one comparisons)

Interpretation:

- based on a-priori chosen δ , e.g. ± 3 g liver weight difference
- [or a-posteriori chosen δ , e.g.]

Example:

90% Conf. interval		
Contrast	Lower	Upper
(a 2-a 1)-(b 2-b 1)	-1,56	1,73
(a 3-a 1)-(b 3-b 1)	-1,88	1,41
(a 4-a 1)-(b 4-b 1)	-2,08	1,21
(a 2-a 1)-(c 2-c 1)	-1,02	2,27
(a 3-a 1)-(c 3-c 1)	-0,55	2,74
(a 4-a 1)-(c 4-c 1)	-1,83	1,46
(a 2-a 1)-(d 2-d 1)	-1,65	1,69
(a 3-a 1)-(d 3-d 1)	-1,86	1,47
(a 4-a 1)-(d 4-d 1)	-2,12	1,22
(a 2-a 1)-(e 2-e 1)	-1,36	1,93
(a 3-a 1)-(e 3-e 1)	-1,45	1,83
(a 4-a 1)-(e 4-e 1)	-2,44	0,84
(a 2-a 1)-(f 2-f 1)	-1,17	2,12
(a 3-a 1)-(f 3-f 1)	-0,69	2,59
(a 4-a 1)-(f 4-f 1)	-1,86	1,60
(a 2-a 1)-(g 2-g 1)	-0,92	2,37
(a 3-a 1)-(g 3-g 1)	-1,63	1,66
(a 4-a 1)-(g 4-g 1)	-1,43	1,86
(a 2-a 1)-(h 2-h 1)	-1,34	1,95
(a 3-a 1)-(h 3-h 1)	-0,75	2,54
(a 4-a 1)-(h 4-h 1)	-0,22	3,07
(b 2-b 1)-(c 2-c 1)	-1,10	2,19
(b 3-b 1)-(c 3-c 1)	-0,31	2,97
(b 4-b 1)-(c 4-c 1)	-1,39	1,90
(b 2-b 1)-(d 2-d 1)	-1,73	1,61
(b 3-b 1)-(d 3-d 1)	-1,63	1,71
(b 4-b 1)-(d 4-d 1)	-1,68	1,65
(b 2-b 1)-(e 2-e 1)	-1,44	1,84
(b 3-b 1)-(e 3-e 1)	-1,22	2,07
(b 4-b 1)-(e 4-e 1)	-2,01	1,28
(b 2-b 1)-(f 2-f 1)	-1,25	2,04
(b 3-b 1)-(f 3-f 1)	-0,46	2,83
(b 4-b 1)-(f 4-f 1)	-1,42	2,04
(b 2-b 1)-(g 2-g 1)	-1,00	2,29
(b 3-b 1)-(g 3-g 1)	-1,40	1,89
(b 4-b 1)-(g 4-g 1)	-1,00	2,29
(b 2-b 1)-(h 2-h 1)	-1,42	1,87
(b 3-b 1)-(h 3-h 1)	-0,51	2,78
(b 4-b 1)-(h 4-h 1)	0,21	3,50
(c 2-c 1)-(d 2-d 1)	-2,27	1,07
(c 3-c 1)-(d 3-d 1)	-2,96	0,38
(c 4-c 1)-(d 4-d 1)	-1,93	1,40

(c 2-c 1)-(e 2-e 1)	-1,99	1,30
(c 3-c 1)-(e 3-e 1)	-2,55	0,74
(c 4-c 1)-(e 4-e 1)	-2,26	1,03
(c 2-c 1)-(f 2-f 1)	-1,79	1,50
(c 3-c 1)-(f 3-f 1)	-1,79	1,50
(c 4-c 1)-(f 4-f 1)	-1,67	1,79
(c 2-c 1)-(g 2-g 1)	-1,54	1,75
(c 3-c 1)-(g 3-g 1)	-2,73	0,56
(c 4-c 1)-(g 4-g 1)	-1,25	2,04
(c 2-c 1)-(h 2-h 1)	-1,96	1,33
(c 3-c 1)-(h 3-h 1)	-1,84	1,45
(c 4-c 1)-(h 4-h 1)	-0,04	3,25
(d 2-d 1)-(e 2-e 1)	-1,41	1,93
(d 3-d 1)-(e 3-e 1)	-1,28	2,05
(d 4-d 1)-(e 4-e 1)	-2,02	1,32
(d 2-d 1)-(f 2-f 1)	-1,21	2,12
(d 3-d 1)-(f 3-f 1)	-0,52	2,81
(d 4-d 1)-(f 4-f 1)	-1,43	2,08
(d 2-d 1)-(g 2-g 1)	-0,96	2,37
(d 3-d 1)-(g 3-g 1)	-1,46	1,88
(d 4-d 1)-(g 4-g 1)	-1,00	2,33
(d 2-d 1)-(h 2-h 1)	-1,38	1,95
(d 3-d 1)-(h 3-h 1)	-0,57	2,76
(d 4-d 1)-(h 4-h 1)	0,21	3,54
(e 2-e 1)-(f 2-f 1)	-1,45	1,84
(e 3-e 1)-(f 3-f 1)	-0,88	2,40
(e 4-e 1)-(f 4-f 1)	-1,06	2,40
(e 2-e 1)-(g 2-g 1)	-1,20	2,09
(e 3-e 1)-(g 3-g 1)	-1,82	1,47
(e 4-e 1)-(g 4-g 1)	-0,63	2,66
(e 2-e 1)-(h 2-h 1)	-1,62	1,67
(e 3-e 1)-(h 3-h 1)	-0,94	2,35
(e 4-e 1)-(h 4-h 1)	0,58	3,87
(f 2-f 1)-(g 2-g 1)	-1,40	1,89
(f 3-f 1)-(g 3-g 1)	-2,58	0,71
(f 4-f 1)-(g 4-g 1)	-1,39	2,07
(f 2-f 1)-(h 2-h 1)	-1,82	1,47
(f 3-f 1)-(h 3-h 1)	-1,70	1,59
(f 4-f 1)-(h 4-h 1)	-0,18	3,28
(g 2-g 1)-(h 2-h 1)	-2,07	1,22
(g 3-g 1)-(h 3-h 1)	-0,76	2,53
(g 4-g 1)-(h 4-h 1)	-0,43	2,85

lab		$\bar{x}_4 - \bar{x}_{Control}$
a	1	3.92
b	2	4.35
c	3	4.10
d	4	4.37
e	5	4.72
f	6	4.05
g	7	3.70
h	8	2.49

- ⇒ Comparison C- vs. high dose between labs e, d, b vs. h
- ⇒ Lab h reveals a lower effect size
- ⇒ Eliminating lab h: global F-test $p \gg 0.10$, no CI relevant increased \implies all labs are similar according to their comparisons vs. C- ... perfect!

IV) Interaction contrasts based on order restriction

i) **Incremental contrasts** (not really order restricted)

$$\max \left\{ \left| (\mu_{lj} - \mu_{lj-1}) - (\mu_{l'j} - \mu_{l'j-1}) \right| \right\}$$

ii) **Isotonic contrasts**

Order restriction: $H_1 : \mu_0 \leq \mu_1 \leq \dots \leq \mu_k \mid <$

Confidence intervals:

$$\frac{L(L-1)}{2} (2^k - 1) \text{ Isotonic contrasts (Bretz 1999)}$$

$$\max \left\{ \left| \sum_{j=0}^k c_j \mu_{lj} - \sum_{j=0}^k c_j \mu_{l'j} \right| \right\}$$

Still more contrasts (e.g. 196), but with very high correlated!

Alternative	Contrast coefficients
$H_1^1 : \mu_C = \mu_1 = \mu_2 < \mu_3$	-0.09, -0.09, -0.09, 0.27
$H_1^2 : \mu_C < \mu_1 = \mu_2 = \mu_3$	-0.27, 0.09, 0.09, 0.09
$H_1^3 : \mu_C = \mu_1 < \mu_2 = \mu_3$	-0.16, -0.16, 0.16, 0.16
$H_1^4 : \mu_C < \mu_1 = \mu_2 < \mu_3$	-0.27, 0, 0, 0.27
$H_1^5 : \mu_C < \mu_1 < \mu_2 < \mu_3$	-0.28, -0.04, 0.04, 0.28
$H_1^6 : \mu_C = \mu_1 < \mu_2 < \mu_3$	-0.16, -0.16, 0.04, 0.28
$H_1^7 : \mu_C < \mu_1 < \mu_2 = \mu_3$	-0.28, -0.04, 0.16, 0.16

Isotonic contrasts for balanced design [**C**, **D**₁, **D**₂, **D**₃]

Margin for equivalence: ±30 g difference

Ia b	Contrast	Lower90% CL	Upper90% CL
a vs b	$H_1^6 : \mu_C = \mu_1 < \mu_2 < \mu_3$	-17,9	9,0
a vs c		-16,6	10,2
a vs. d		-17,8	9,2
a vs. e		-21,5	5,3
a vs f		-16,5	12,1
a vs. g		-15,2	11,7
a vs h		-1,4	25,5
b vs c		-12,2	14,7
b vs. d		-13,3	13,7
b vs. e		-17,0	9,8
b vs f	-12,0	16,5	
b vs. g	-10,7	16,2	
b vs h	3,1	29,9	
c vs. d	-14,5	12,5	
c vs. e	-18,3	8,6	
c vs f	-13,2	15,3	
c vs. g	-11,9	14,9	
c vs h	1,8	28,7	
d vs. e	-17,3	9,7	
d vs f	-12,3	16,4	
d vs. g	-11,0	16,0	
d vs h	2,8	29,8	
e vs f	-8,4	20,1	
e vs. g	-7,1	19,8	
e vs h	6,7	33,6	
f vs. g	-13,8	14,7	
f vs h	0,0	28,5	
g vs. h	0,3	27,2	
a vs b	$H_1^1 : \mu_C = \mu_1 = \mu_2 < \mu_3$	-15,2	8,6
a vs c		-18,4	5,4
a vs. d		-15,3	8,6
a vs. e		-20,2	3,6
a vs f		-18,1	7,6
a vs. g		-12,2	11,7
a vs h		-3,0	20,8
b vs c		-15,2	8,7
b vs. d		-12,0	11,9
b vs. e		-16,9	6,9
b vs f		-14,8	10,9
b vs. g		-8,9	15,0
b vs h		0,3	24,1
c vs. d		-8,8	15,1
c vs. e		-13,7	10,2
c vs f		-11,5	14,2
c vs. g		-5,7	18,2
c vs h		3,5	27,3

e vs f	12,0	42,7	
e vs. g	-3,9	20,0	
e vs h	5,3	29,1	
f vs. g	-7,9	17,8	
f vs h	1,2	26,9	
g vs. h	-2,8	21,1	
a vs b	$H_1^3 : \mu_C = \mu_1 < \mu_2 = \mu_3$	-15,7	8,2
a vs c		-10,5	13,4
a vs. d		-15,3	8,7
a vs. e		-16,4	7,5
a vs f		-10,5	14,0
a vs. g		-14,4	9,4
a vs h		-1,8	22,0
b vs c		-6,7	17,1
b vs. d		-11,6	12,4
b vs. e		-12,6	11,2
b vs f	-6,8	17,7	
b vs. g	-10,7	13,2	
b vs h	1,9	25,8	
c vs. d	-16,8	7,2	
c vs. e	-17,8	6,0	
c vs f	-12,0	12,5	
c vs. g	-15,9	8,0	
c vs h	-3,3	20,6	
d vs. e	-13,1	10,9	
d vs f	-7,3	17,4	
d vs. g	-11,2	12,9	
d vs h	1,4	25,5	
e vs f	-6,0	18,4	
e vs. g	-10,0	13,9	
e vs h	2,6	26,5	
f vs. g	-16,5	8,0	
f vs h	-3,9	20,6	
g vs. h	0,7	24,5	
a vs b	$H_1^2 : \mu_C < \mu_1 = \mu_2 = \mu_3$	-13,6	10,2
a vs c		-7,5	16,4
a vs. d		-14,0	10,4
a vs. e		-12,9	11,0
a vs f		-8,3	15,8
a vs. g		-9,2	14,7
a vs h		-4,3	19,5
b vs c		-5,8	18,1
b vs. d		-12,3	12,1
b vs. e		-11,2	12,7
b vs f	-6,6	17,5	
b vs. g	-7,5	16,4	
b vs h	-2,6	21,2	
c vs. d	-18,4	5,9	

d vs f	-6,7	17,8
d vs. g	-7,6	16,7
d vs h	-2,8	21,6
e vs f	-7,3	16,7
e vs. g	-8,2	15,6
e vs h	-3,4	20,5
f vs. g	-13,0	11,0
f vs h	-8,2	15,9
g vs. h	-7,1	16,8
a vs b	-18,3	10,9
a vs c	-16,2	13,0
a vs. d	-18,7	10,9
a vs. e	-21,5	7,7
a vs f	-16,5	14,3
a vs. g	-12,7	16,5
a vs h	-2,2	27,0
b vs c	-12,4	16,8
b vs. d	-15,0	14,7
b vs. e	-17,8	11,4
b vs f	-12,7	18,0
b vs. g	-9,0	20,2
b vs h	1,5	30,7
c vs. d	-17,1	12,5
c vs. e	-20,0	9,2
c vs f	-14,9	15,9
c vs. g	-11,2	18,1
c vs h	-0,7	28,5
d vs. e	-17,9	11,8
d vs f	-12,8	18,4
d vs. g	-9,0	20,6
d vs h	1,4	31,1
e vs f	-9,5	21,2
e vs. g	-5,8	23,4
e vs h	4,7	33,9
f vs. g	-12,4	18,3
f vs h	-1,9	28,8
g vs. h	-4,1	25,1
a vs b	-16,9	10,0
a vs c	-9,7	17,2
a vs. d	-16,9	10,4
a vs. e	-16,9	10,0
a vs f	-10,2	17,2
a vs. g	-13,3	13,6
a vs h	-2,2	24,6
b vs c	-6,3	20,6
b vs. d	-13,5	13,8
b vs. e	-13,4	13,5
b vs f	-6,8	20,6

$$H_1^4 : \mu_C < \mu_1 = \mu_2 < \mu_3$$

$$H_1^7 : \mu_C < \mu_1 < \mu_2 = \mu_3$$

c vs. g	-17,0	9,9
c vs h	-5,9	20,9
d vs. e	-13,8	13,5
d vs f	-7,2	20,7
d vs. g	-10,2	17,1
d vs h	0,8	28,1
e vs f	-6,8	20,6
e vs. g	-9,8	17,0
e vs h	1,2	28,1
f vs. g	-17,0	10,4
f vs h	-6,0	21,4
g vs. h	-2,4	24,5
a vs b	-18,9	10,6
a vs c	-15,7	13,8
a vs. d	-19,2	10,8
a vs. e	-21,8	7,7
a vs f	-16,0	15,1
a vs. g	-13,9	15,7
a vs h	-1,6	27,9
b vs c	-11,6	18,0
b vs. d	-15,0	15,0
b vs. e	-17,7	11,9
b vs f	-11,8	19,3
b vs. g	-9,7	19,9
b vs h	2,5	32,1
c vs. d	-18,2	11,7
c vs. e	-20,9	8,7
c vs f	-15,0	16,0
c vs. g	-12,9	16,6
c vs h	-0,7	28,9
d vs. e	-17,9	12,1
d vs f	-12,0	19,5
d vs. g	-9,9	20,1
d vs h	2,4	32,3
e vs f	-8,9	22,1
e vs. g	-6,8	22,8
e vs h	5,4	35,0
f vs. g	-14,2	16,9
f vs h	-1,9	29,1
g vs. h	-2,5	27,0

$$H_1^5 : \mu_C < \mu_1 < \mu_2 < \mu_3$$

Again lab h behaves not similar, but rejection of lab h shows similarity for all but one shape of dose-response.

Interpretation:

- selecting ‘best fitting’ shape, here H⁶

V) Special case: linear contrasts only
 (Equivalence approach for parallel-line assay)

Comparison	90% lower CI	90% upper CI
a vs b	-9.4	4.2
a vs c	-8.5	5.2
a vs. d	-9.4	4.4
a vs. e	-11.5	2.2
a vs f	-8.5	6.1
a vs. g	-7.9	5.8
a vs h	0.3	14.0
b vs c	-5.9	7.8
b vs. d	-6.7	7.0
b vs. e	-8.9	4.8
b vs f	-5.7	8.8
b vs. g	-5.3	8.4
b vs h	2.9	16.6
c vs. d	-7.7	6.1
c vs. e	-9.8	3.9
c vs f	-6.7	7.8
c vs. g	-6.2	7.4
c vs h	1.9	15.6
d vs. e	-9.0	4.7
d vs f	-5.9	8.7
d vs. g	-5.4	8.3
d vs h	2.7	16.5
e vs f	-3.7	10.8
e vs. g	-3.3	10.4
e vs h	4.9	18.6
f vs. g	-7.2	7.3
f vs h	1.0	15.5
g vs. h	1.4	15.0

- I.e. homogeneity of 2 or more straight lines where doses are in groups (model I of linear regression), where for model II see Bofinger (1999)
- This can be generalized to any contrast, e.g. similarity of a step contrast, or a concave contrast,...

5. TAKE HOME MESSAGE

- Similarity of multi-labs dose-response assays can be demonstrated by $(1-2\alpha)$ confidence intervals of specified interaction contrasts
- For unbalanced designs SAS and R software (Bretz et al., 2002) available: both resampling and parametric (can be downloaded from www.bioinf.uni-hannover.de)
- The a-priori or even post hoc definition of margins for equivalence for the differences in absolute terms or relative to SD remains difficult \implies confidence intervals for a ratio to control are more appropriate (% change) \implies further research

References

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