

Nano Toxicology Interlaboratory Experiment

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Introduction

Experiment tested whether agreement among laboratories performing biological assay measurements can be achieved. Previous published results in the field of nano toxicology were contradictory.

Uncertainty analysis was *top down*, not bottom up as in the GUM.

Experimental design and simple *data analysis* were critical for monitoring and assessing system performance.

Quantification of uncertainty was done using a *Bayesian hierarchical non-linear model* fitted using Markov Chain Monte Carlo methods.

Details of the Experiment

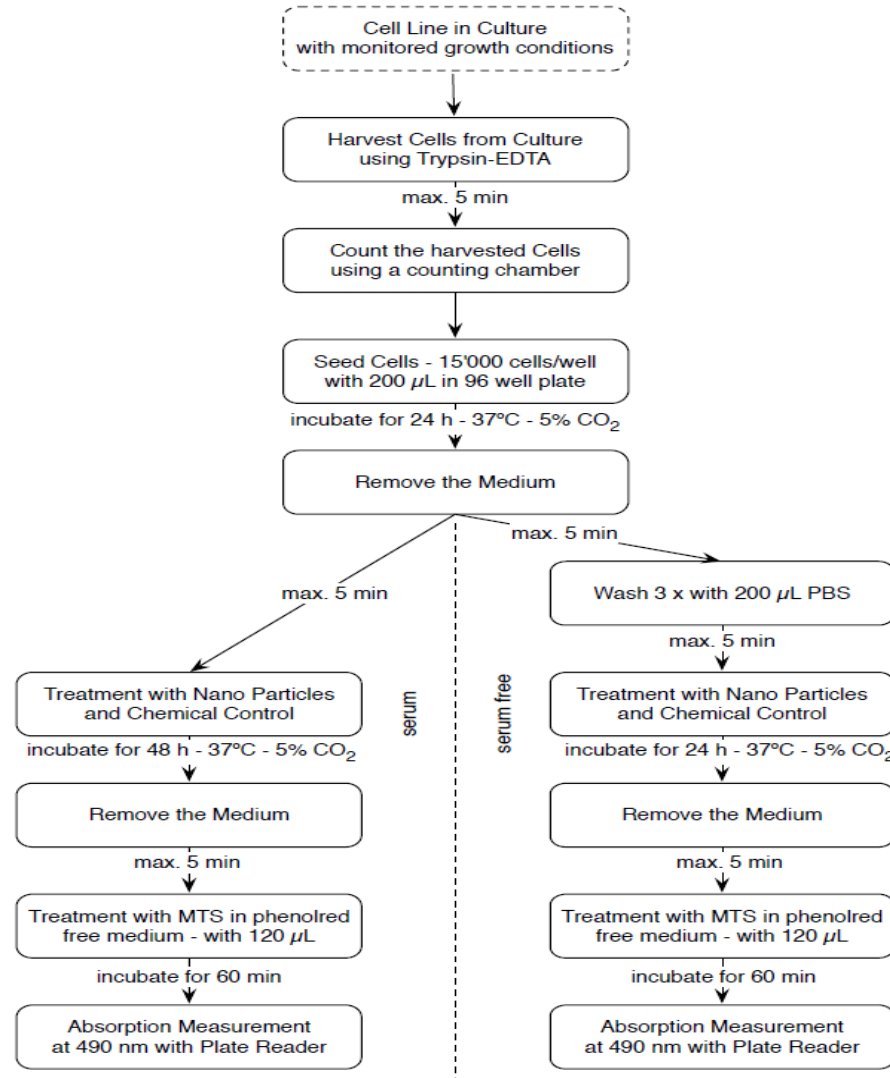
- Cells treated with several different concentrations of nanoparticles or chemical control
- MTS cell viability assay
- Signal related to the number of metabolically active cells
- Measurement: absorbance at 490 nm
- Specifically designed plate
- Multiple cell lines
- Multiple laboratories

Plate Design

	1	2	3	4	5	6	7	8	9	10	11	12	
A	●	●	●	●	●	●	●	●	●	●	●	●	
B	●	◐	◐	◐	◐	○	○	○	○	○	○	●	0 µg/mL
C	●	◑	◑	◑	◑	○	○	◑	◑	◑	◑	●	1 µg/mL
D	●	◑	◑	◑	◑	○	○	◑	◑	◑	◑	●	10 µg/mL
E	●	◑	◑	◑	◑	○	○	◑	◑	◑	◑	●	25 µg/mL
F	●	◑	◑	◑	◑	○	○	◑	◑	◑	◑	●	50 µg/mL
G	●	◑	◑	◑	◑	○	○	◑	◑	◑	◑	●	100 µg/mL
H	●	●	●	●	●	●	●	●	●	●	●	●	
		No cells	Ctrl rep1	Ctrl rep2	Ctrl rep3	No treatment	No cells No treatment	Test rep1	Test rep2	Test rep3	No cells		
	Chemical Ctrl					NP Test							

Process Flowchart for each laboratory

Nano Particles



Sources of Variability

- Pipetting: seed density and chemical dosing
- Instrument performance
- Material handling

- Cell type
- Culture conditions
- Laboratory

Plate Design: Assessment and control of Variability

	<i>Brief Control Description</i>
Column 2	Background correction for the chemical dosing.
Columns 3,4,5	Triplicate reference chemical control.
Column 6	Within multichannel pipetting variance. Non-treated cells seeded with a single ejection step.
Column 7	No cells but MTS reagent (last step of assay procedure).
Column 11	Background correction for the ENM dosing.
Black wells	Contain medium from the time of cell seeding on. Prevents edge effects that might occur during longer incubation times (i.e. evaporation).
Row B column 3,4,5 and 8,9,10	Between multichannel pipetting variance. Solvent treated cells seeded in different ejection steps.

6-well Pipette

	1	2	3	4	5	6	7	8	9	10	11	12	
A	●	●	●	●	●	●	●	●	●	●	●	●	
B	●	○	○	○	○	○	○	○	○	○	○	○	0 µg/mL
C	●	○	○	○	○	○	○	○	○	○	○	○	1 µg/mL
D	●	○	○	○	○	○	○	○	○	○	○	○	10 µg/mL
E	●	○	○	○	○	○	○	○	○	○	○	○	25 µg/mL
F	●	○	○	○	○	○	○	○	○	○	○	○	50 µg/mL
G	●	○	○	○	○	○	○	○	○	○	○	○	100 µg/mL
H	●	○	○	○	○	○	○	○	○	○	○	○	
	No cells	Ctrl rep1	Ctrl rep2	Ctrl rep3	No treatment	No cells	No treatment	Test rep1	Test rep2	Test rep3	No cells		
	Chemical Ctrl						NP Test						

Comparison of control measurements (no cells) two labs

	Lab A Mean (std) over all plates	Lab B Mean (std) over all plates
Column 2 (background CC)	0.056 (0.0007) OD	0.057 (0.004) OD
Column 7	0.057 (0.0009) OD	0.058 (0.003) OD
Column 11 (background NP)	0.20 (0.04) OD	0.23 (0.04) OD
Black cells	0.056 (0.0005) OD	0.058 (0.004) OD

	1	2	3	4	5	6	7	8	9	10	11	12	
A	●	●	●	●	●	●	●	●	●	●	●	●	
B	●	◐	◐	◐	◐	○	○	○	○	○	○	●	0 µg/mL
C	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	1 µg/mL
D	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	10 µg/mL
E	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	25 µg/mL
F	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	50 µg/mL
G	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	100 µg/mL
H	●	●	●	●	●	●	●	●	●	●	●	●	
	No cells	Ctrl rep1	Ctrl rep2	Ctrl rep3	No treatment	No cells No treatment	Test rep1	Test rep2	Test rep3	No cells			
	Chemical Ctrl					NP Test							

- Both labs appear to have good control of pipette volume on average
- Lab B is more variable

Column 6 - cells but no treatment (maximum absorbance)

Plate	Lab A Mean (std) OD	Lab B Mean (std) OD
1	2.29 (0.11)	2.10 (0.1)
2	2.24 (0.11)	2.43 (0.1)
3	2.18 (0.05)	2.47 (0.13)
4	2.23 (0.10)	2.82 (0.12)
5	2.19 (0.04)	2.80 (0.45)
6	2.17 (0.03)	

Within pipette variability reflected in std.
Plate to plate variability reflected in
differences between means of plates.

- Suggests initial cell density (i.e. cell counting) is in less control in lab B
- May need to be more specific in the protocol instructions

	1	2	3	4	5	6	7	8	9	10	11	12	
A	●	●	●	●	●	●	●	●	●	●	●	●	
B	●	◐	◐	◐	◐	○	○	○	○	○	○	●	0 µg/mL
C	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	1 µg/mL
D	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	10 µg/mL
E	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	25 µg/mL
F	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	50 µg/mL
G	●	◐	◐	◐	◐	○	○	◐	◐	◐	◐	●	100 µg/mL
H	●	●	●	●	●	●	●	●	●	●	●	●	
	No cells	Ctrl rep1	Ctrl rep2	Ctrl rep3	No treatment	No cells	No treatment	Test rep1	Test rep2	Test rep3	No cells		
	Chemical Ctrl						NP Test						

Row B - cells but no treatment (maximum absorbance)

Plate	Lab A Mean (std) OD Col 3,4,5	Lab A Mean (std) OD Col 8,9,10	Lab B Mean (std) OD Col 3,4,5	Lab B Mean (std) OD Col 8,9,10
1	2.30 (0.08)	2.43(0.05)	2.15 (0.14)	2.48(0.05)
2	2.27 (0.01)	2.26(0.06)	2.54 (0.25)	2.45(0.15)
3	2.26 (0.05)	2.21(0.004)	2.47 (0.13)	2.36(0.12)
4	2.54 (0.05)	2.22(0.02)	2.77 (0.12)	2.98(0.10)
5	2.22 (0.04)	2.17(0.03)	2.72 (0.13)	2.78(0.12)
6	2.18 (0.01)	2.26(0.02)		

Between pipette variability reflected in std.
Plate to plate variability reflected in differences between plate means.

	1	2	3	4	5	6	7	8	9	10	11	12	
A	●	●	●	●	●	●	●	●	●	●	●	●	
B	●	●	●	●	●	○	○	○	○	○	○	●	0 µg/mL
C	●	●	●	●	●	○	○	●	●	●	●	●	1 µg/mL
D	●	●	●	●	●	○	○	●	●	●	●	●	10 µg/mL
E	●	●	●	●	●	○	○	●	●	●	●	●	25 µg/mL
F	●	●	●	●	●	○	○	●	●	●	●	●	50 µg/mL
G	●	●	●	●	●	○	○	●	●	●	●	●	100 µg/mL
H	●	●	●	●	●	●	●	●	●	●	●	●	
	No cells	Ctrl rep1	Ctrl rep2	Ctrl rep3	No treatment	No cells	No treatment	Test rep1	Test rep2	Test rep3	No cells		
	Chemical Ctrl						NP Test						

Adjustments to measurements for dose response estimation

- Each plate has 3 sets of dose response measurements for CC (cols 3, 4, 5)
subtract background in col 2 and divide by (maximum absorbance in col 6-black cell absorbance)
- Each plate has 3 sets of dose response measurements for NP (cols 8, 9, 10)
subtract background in col 11 and divide by (maximum absorbance in col 6-black cell absorbance)

Dividing by row entries of column 6
minimizes the effect of **within** pipette
variability (confounded with effect of dose),
better for Lab A.

Alternate approach:
divide by entry in row B
minimizes effect of
between pipette variability.
This approach could be
better for Lab B.

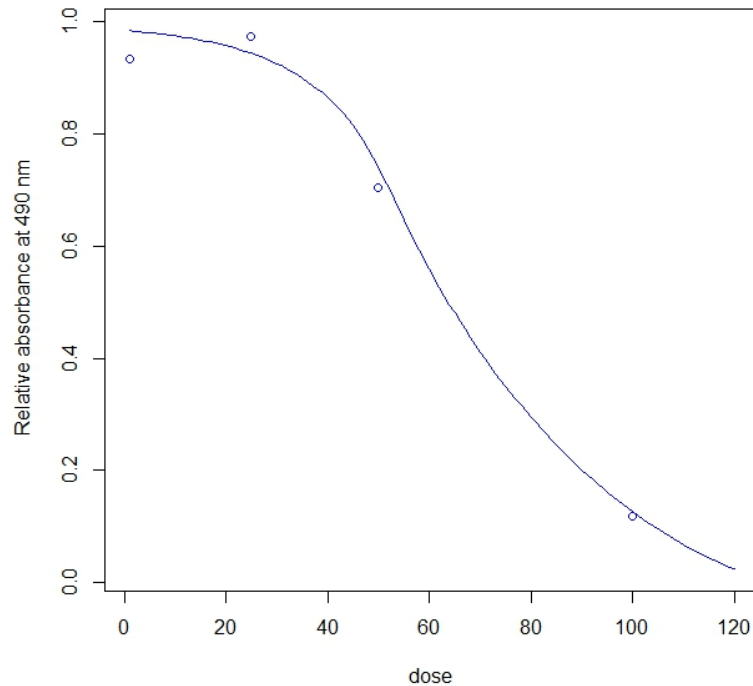
	1	2	3	4	5	6	7	8	9	10	11	12	
A	●	●	●	●	●	●	●	●	●	●	●	●	
B	●	◐	◐	◐	◐	○	○	○	○	○	○	●	0 µg/mL
C	●	◑	◑	◑	◑	○	○	◑	◑	◑	◑	●	1 µg/mL
D	●	◒	◒	◒	◒	○	○	◒	◒	◒	◒	●	10 µg/mL
E	●	◓	◓	◓	◓	○	○	◓	◓	◓	◓	●	25 µg/mL
F	●	◔	◔	◔	◔	○	○	◔	◔	◔	◔	●	50 µg/mL
G	●	◕	◕	◕	◕	○	○	◕	◕	◕	◕	●	100 µg/mL
H	●	●	●	●	●	●	●	●	●	●	●	●	
	No cells	Ctrl rep1	Ctrl rep2	Ctrl rep3	No treatment	No cells	No treatment	Test rep1	Test rep2	Test rep3	No cells		
	Chemical Ctrl						NP Test						

Analysis of Dose Response (statistical model)

$$E(1 - r_i) = \frac{\gamma}{1 + e^{\frac{(\alpha - x_i)}{\beta}}}$$

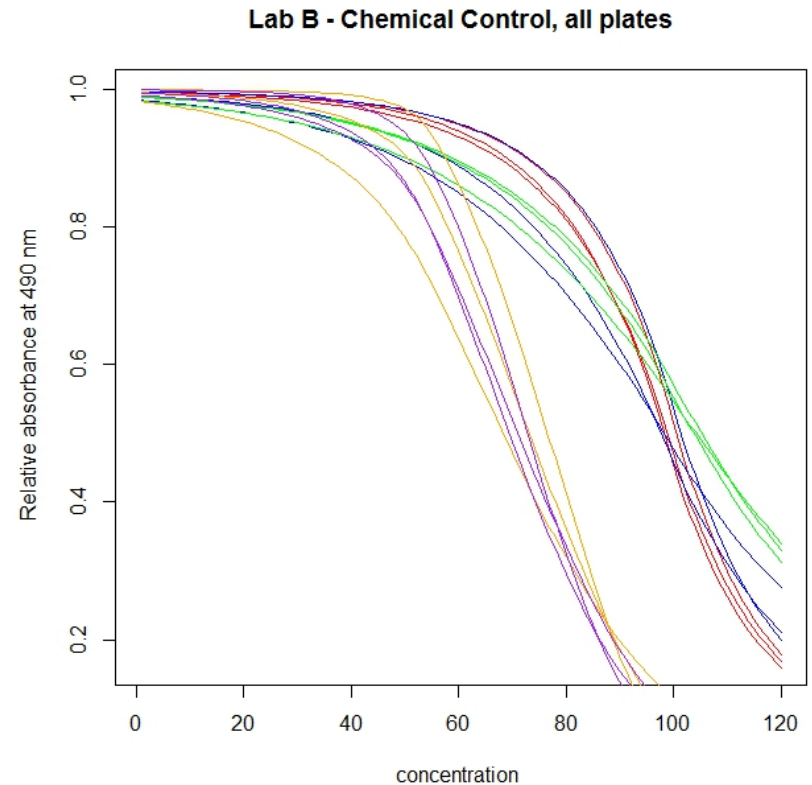
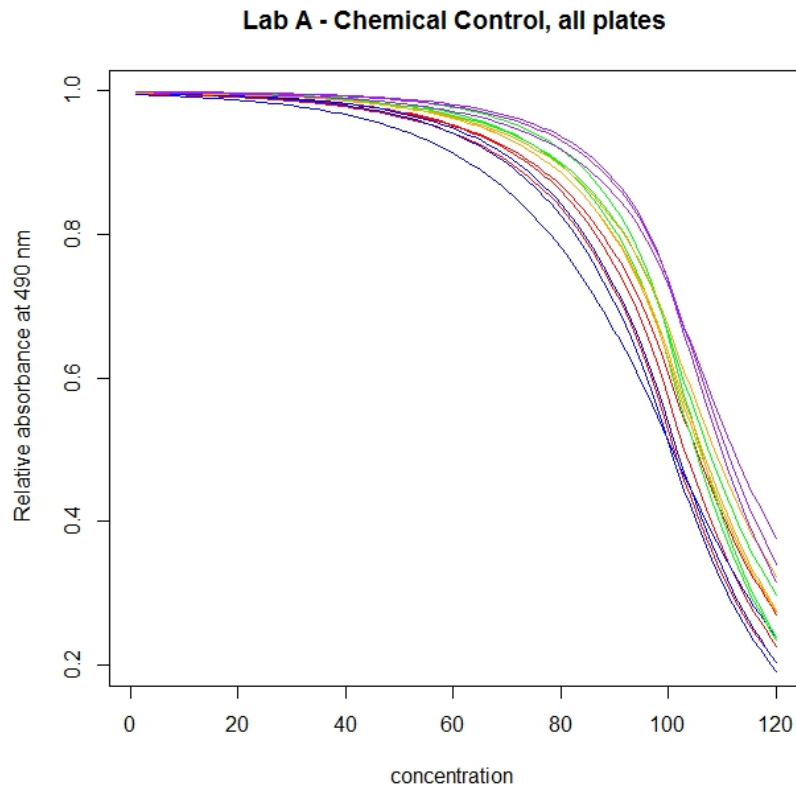
r_i is the normalized response,
 x_i is the dose

Fitted using MCMC



Chemical Control Comparison

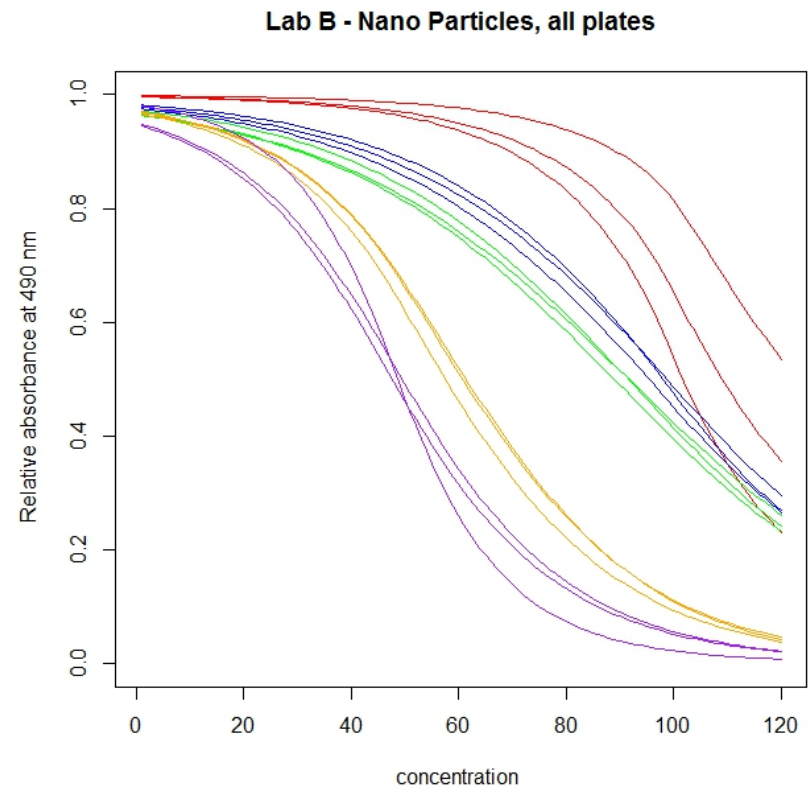
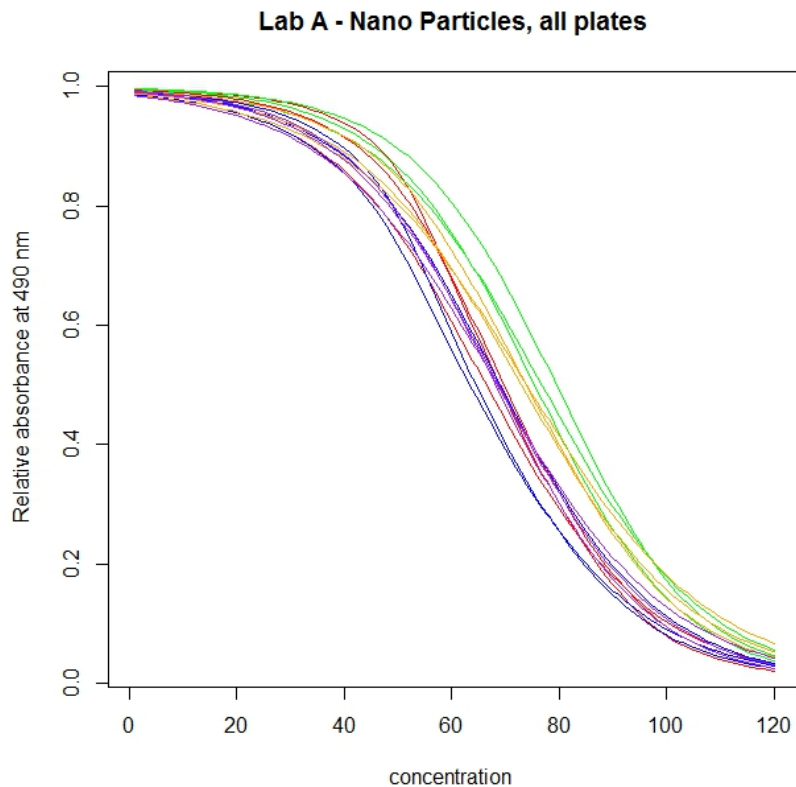
Multiple plates, 3 curves per plate



Replicate curves on each plate are similar –variability due to **between** pipette seeding and chemical dosing can be captured by combining the 3 replicates

Nano particles Comparison

Multiple plates, 3 curves per plate

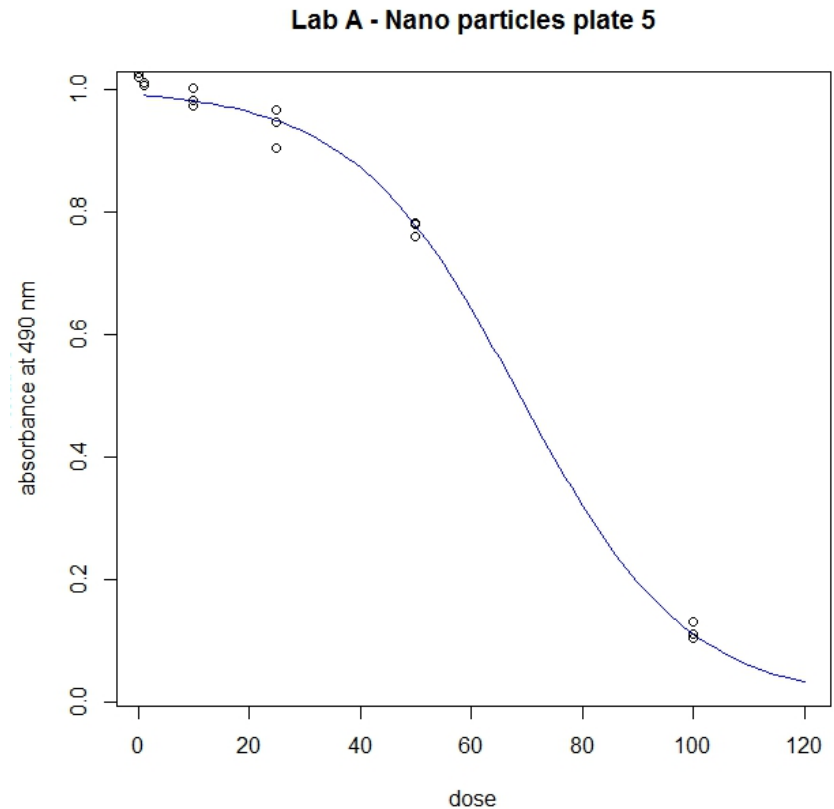


Replicate curves on each plate are similar –variability due to **between** pipette seeding and chemical dosing can be captured by combining the 3 replicates

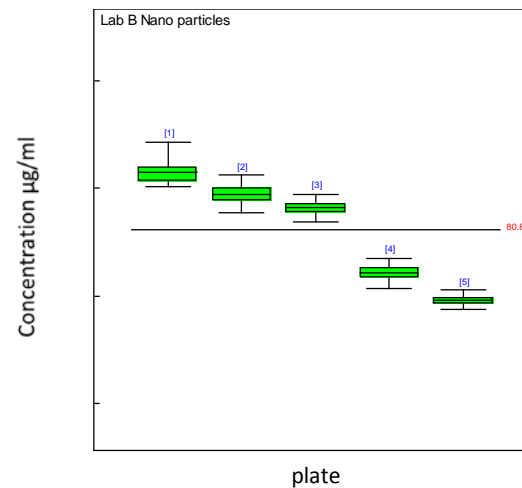
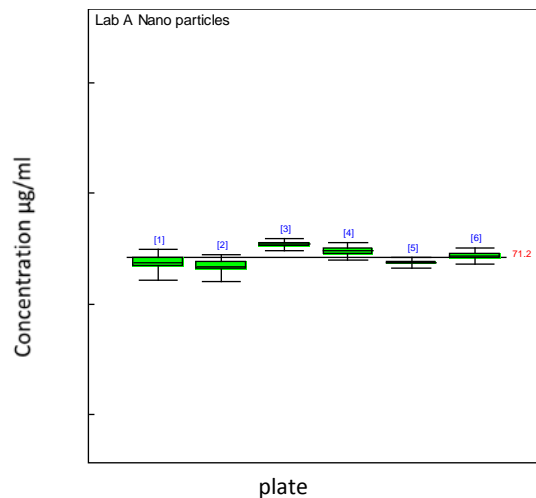
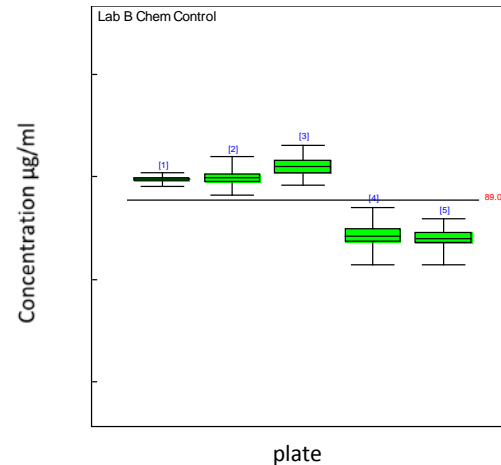
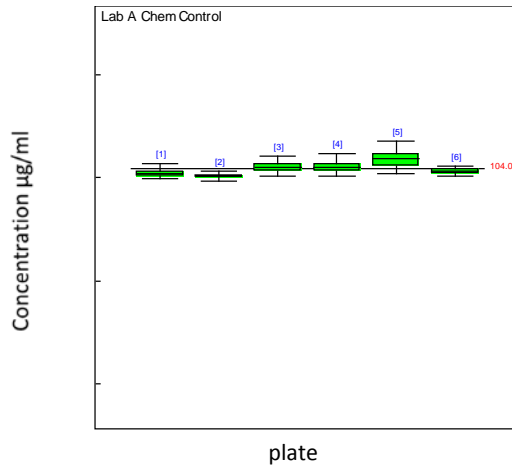
Combine reps on each plate
(col 3, 4, 5 or 8, 9, 10)

Model for each plate:

$$E(1 - r_{ij}) = \frac{\gamma}{1 + e^{\frac{(\alpha - x_i)}{\beta}}}, \quad j = 1, 2, 3$$



EC₅₀ control and nanoparticles per plate



Row B

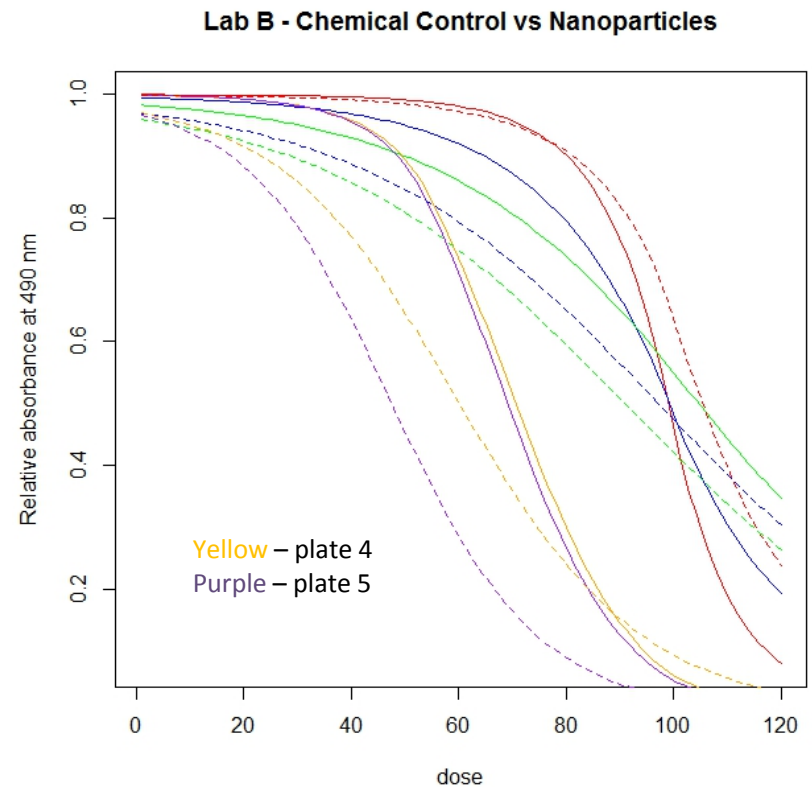
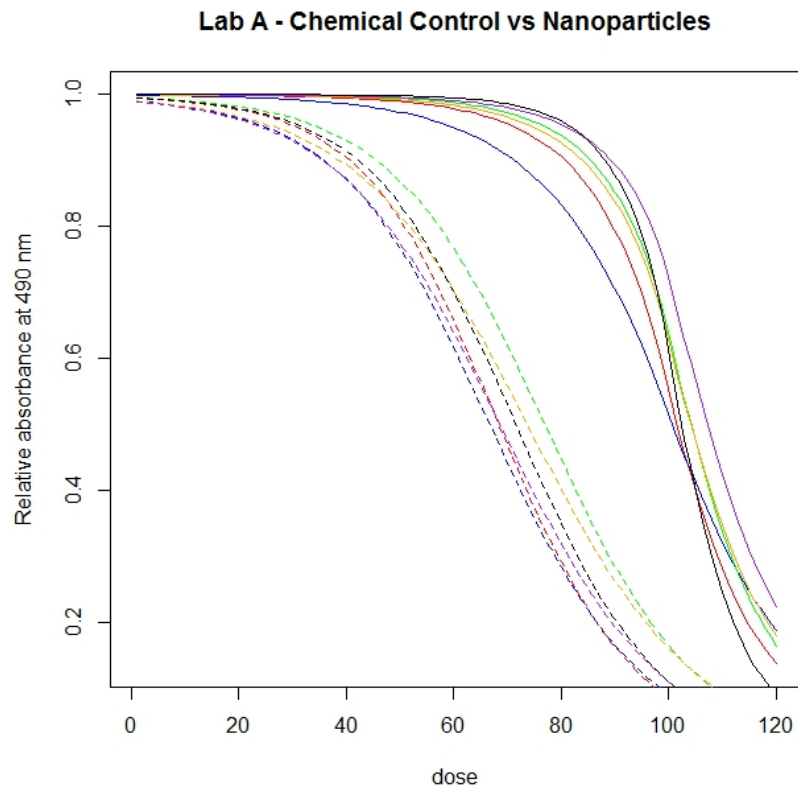
Plate	Lab A Mean (std) Col 3,4,5	Lab B Mean(std) Col 3,4,5
1	2.30 (0.08)	2.15 (0.14)
2	2.27 (0.01)	2.54 (0.25)
3	2.26 (0.05)	2.47 (0.13)
4	2.54 (0.05)	2.77 (0.12)
5	2.22 (0.04)	2.72 (0.13)
6	2.18 (0.01)	

Plate	Lab A Mean (std) Col 8,9,10	Lab B Mean(std) Col 8,9,10
1	2.43(0.05)	2.48(0.05)
2	2.26(0.06)	2.45(0.15)
3	2.21(0.004)	2.36(0.12)
4	2.22(0.02)	2.98(0.10)
5	2.17(0.03)	2.78(0.12)
6	2.26(0.02)	

Uncertainty from **between** pipette effects and other unknown factors

Chemical Control vs. Nano Particles

Replicate Plate curves



Lot more variability among plates for Lab B - 2 separate sets?
Also, relationship between CC and NP curves according to plate for Lab B.

Model for Consensus curve

Lab A – all plates behave well but there is some plate to plate variability which can be captured using a hierarchical model:

$$E(1 - r_{ij}) = \frac{\gamma_i}{\left(1 + e^{\left\{(\alpha_i - x_j)/\beta_i\right\}}\right)} \text{ for } i = 1, \dots, 5 \text{ and } j = 1, \dots, 6$$

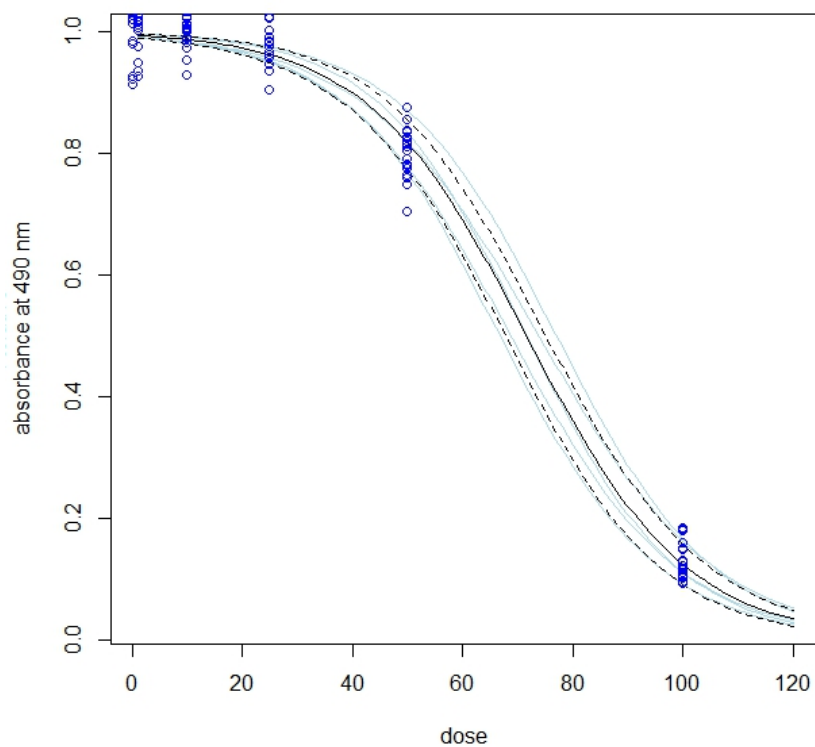
$$\alpha_i \sim N(\alpha, \sigma_\alpha), \log(\beta_i) \sim N(\beta, \sigma_\beta), \log(\gamma_i) \sim N(\gamma, \sigma_\gamma)$$

Consensus:

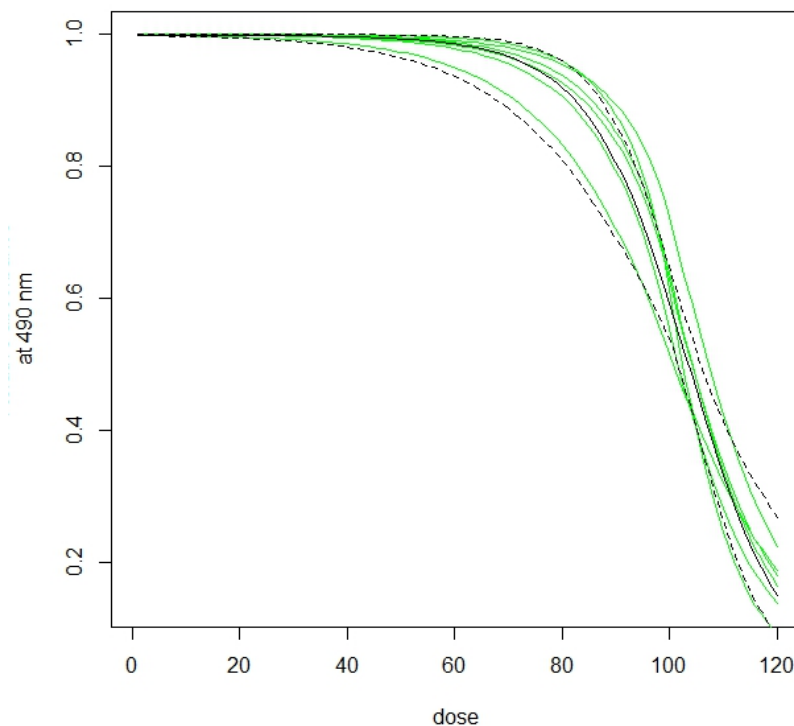
$$E(1 - r_i) = \frac{e^\gamma}{1 + e^{\frac{(\alpha - x_i)}{e^\beta}}}$$

Consensus curves with 95% HPD, estimation via MCMC

Lab A - Nano particles consensus



Lab A - Chemical Control consensus



Uncertainty from **between** pipette effects plus “plate” effects

Lab B

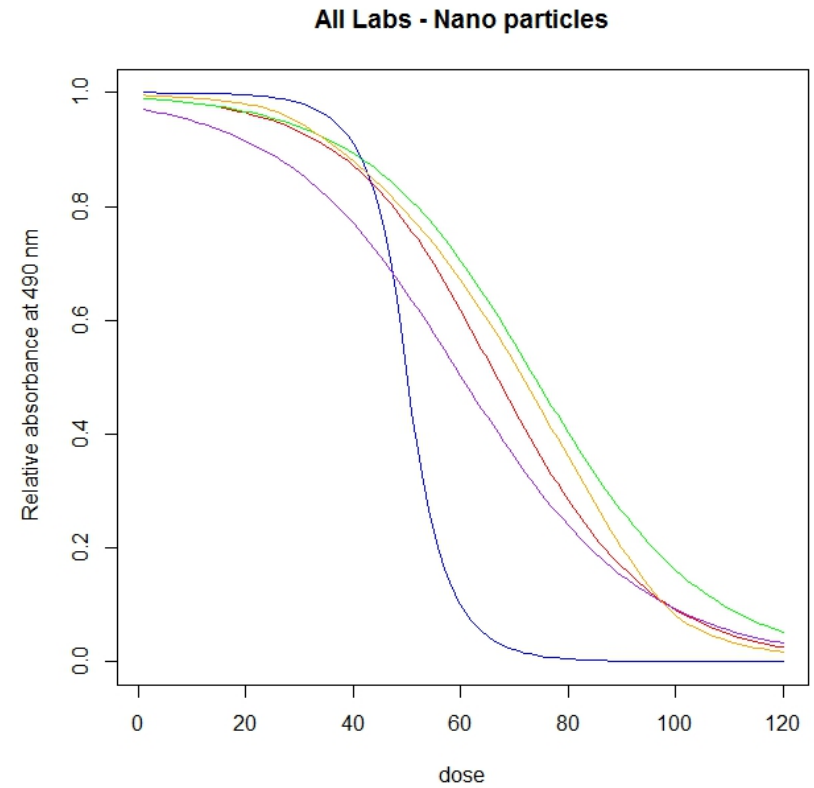
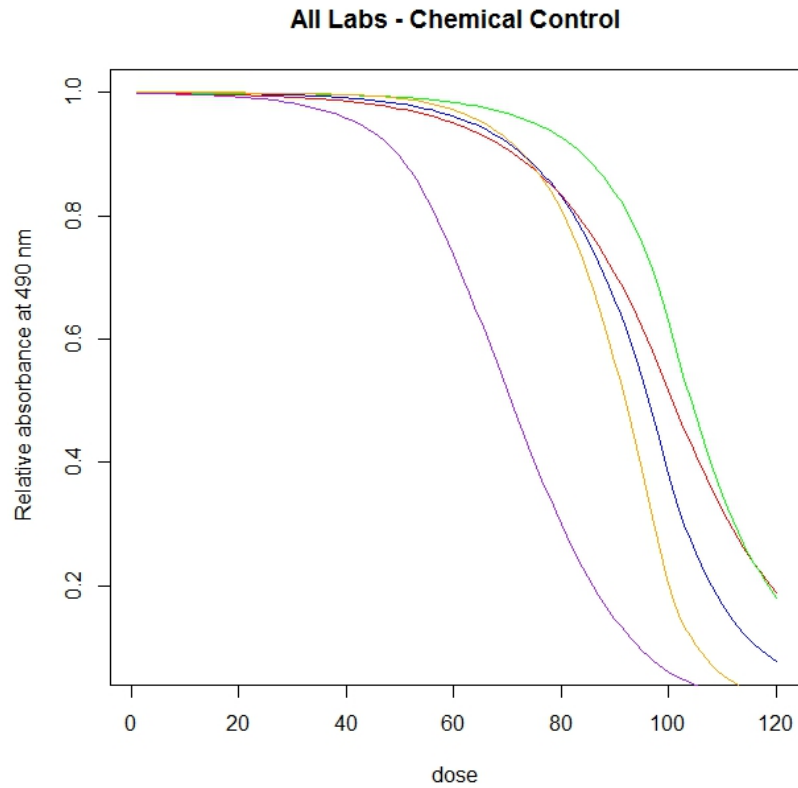
- Has two subsets of similar plates, not clear how or if these should be combined to form a consensus.
- The set that has similar values of the control variables to Lab A has curves that are less similar than the other set.

Interlaboratory study

- 5 laboratories
- 2 cell lines
- 2 types of cell growing conditions
- Separate analyses for cell lines and growing conditions
- Good overall agreement among labs with some outliers.

Lab Consensus curves

single cell line, single growing condition



Conclusions

- It is possible to achieve agreement among laboratories making biological assay measurements.
- Careful monitoring of the protocol is necessary.
- Top-down Uncertainty analysis using MCMC is viable.

Potential Experimental Design improvements:

- More plates
- Concentrations close to anticipated EC_{50}
- Control treatment with “known” EC_{50} value

Potential Uncertainty analysis improvements:

- Bottom-up uncertainty evaluation for individual absorbance measurements combined with the top-down approach