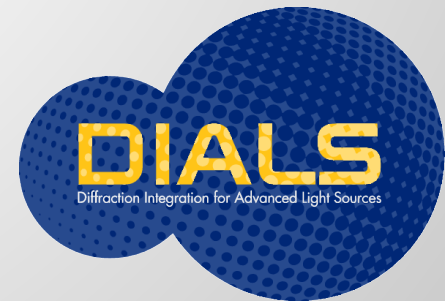


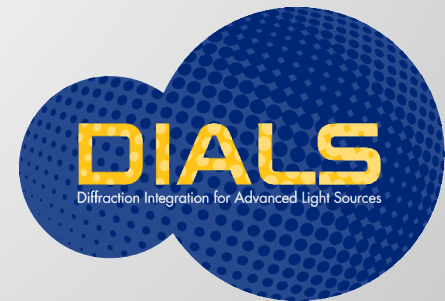
Model refinement

David Waterman

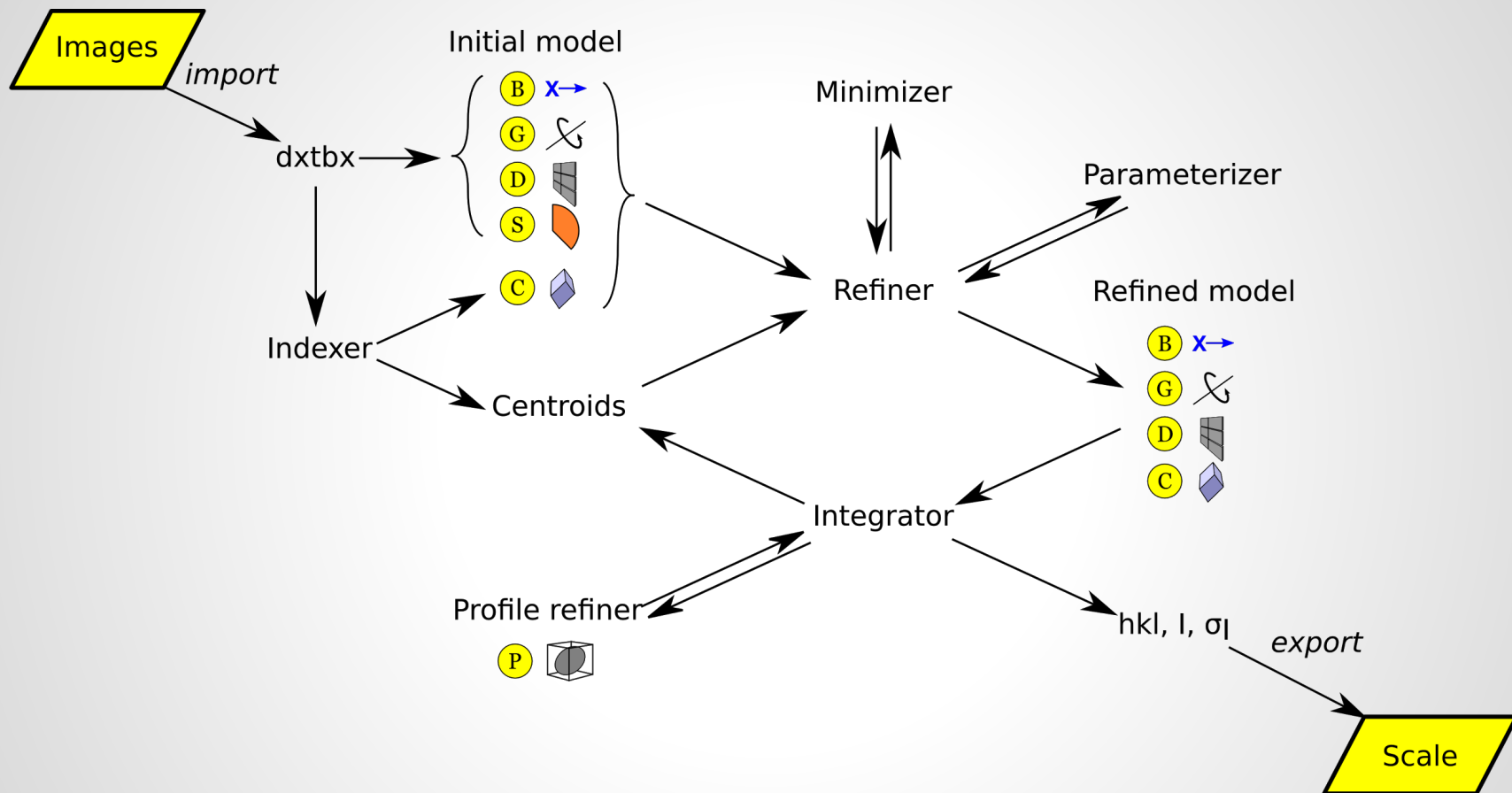
DIALS-6 / LBNL / May 27 2015



1. Centroid refinement
2. Parameterisation
3. Modularity
4. Scan-varying refinement
5. Joint multiple experiments
6. Multi-tile metrology
7. Tools for large jobs

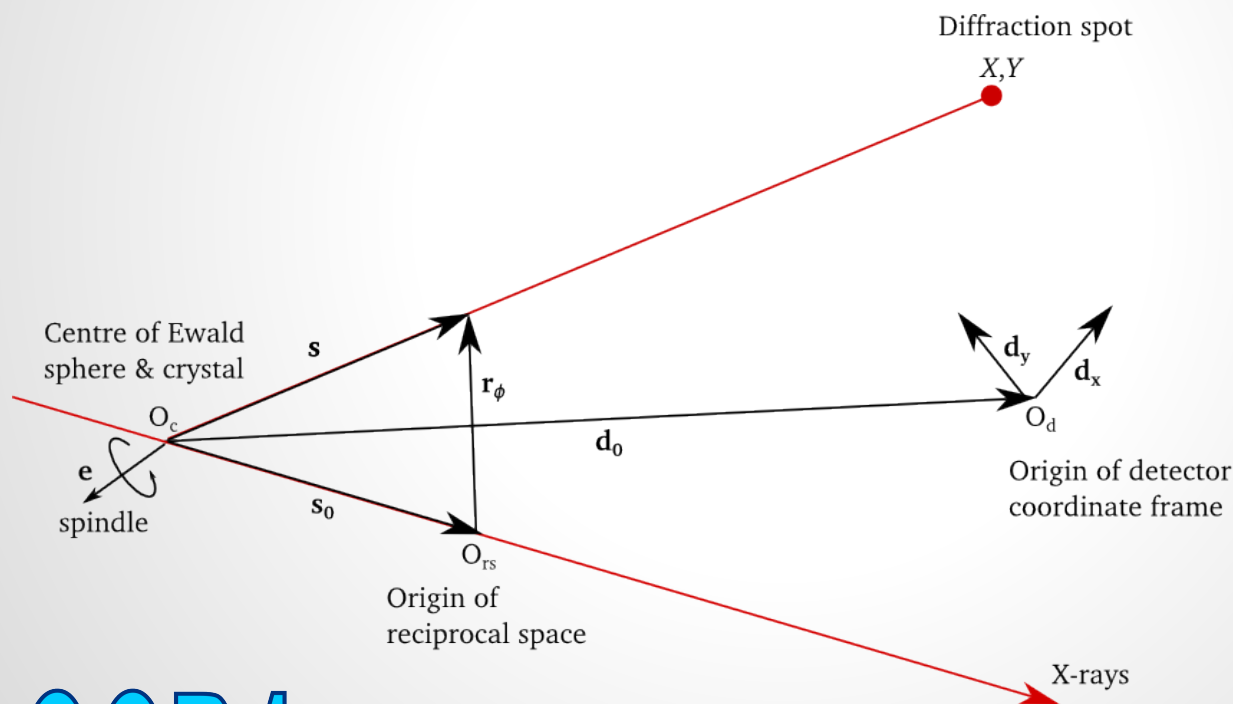


Centroid refinement



Centroid refinement

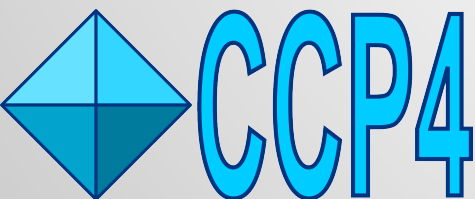
- Refine parameters that affect *central impacts**
- Parameters that affect *general impacts* (mosaicity, $\Delta\lambda$, ...) are determined by profile modelling



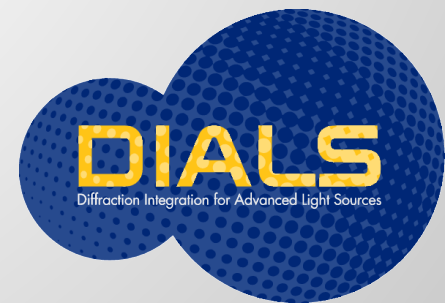
$$\mathbf{d} = (d_x | d_y | d_0)$$

$$\mathbf{D} = \mathbf{d}^{-1}$$

$$\mathbf{v} = \mathbf{D}\mathbf{s} = \begin{pmatrix} \alpha X \\ \alpha Y \\ 1/\alpha \end{pmatrix}$$

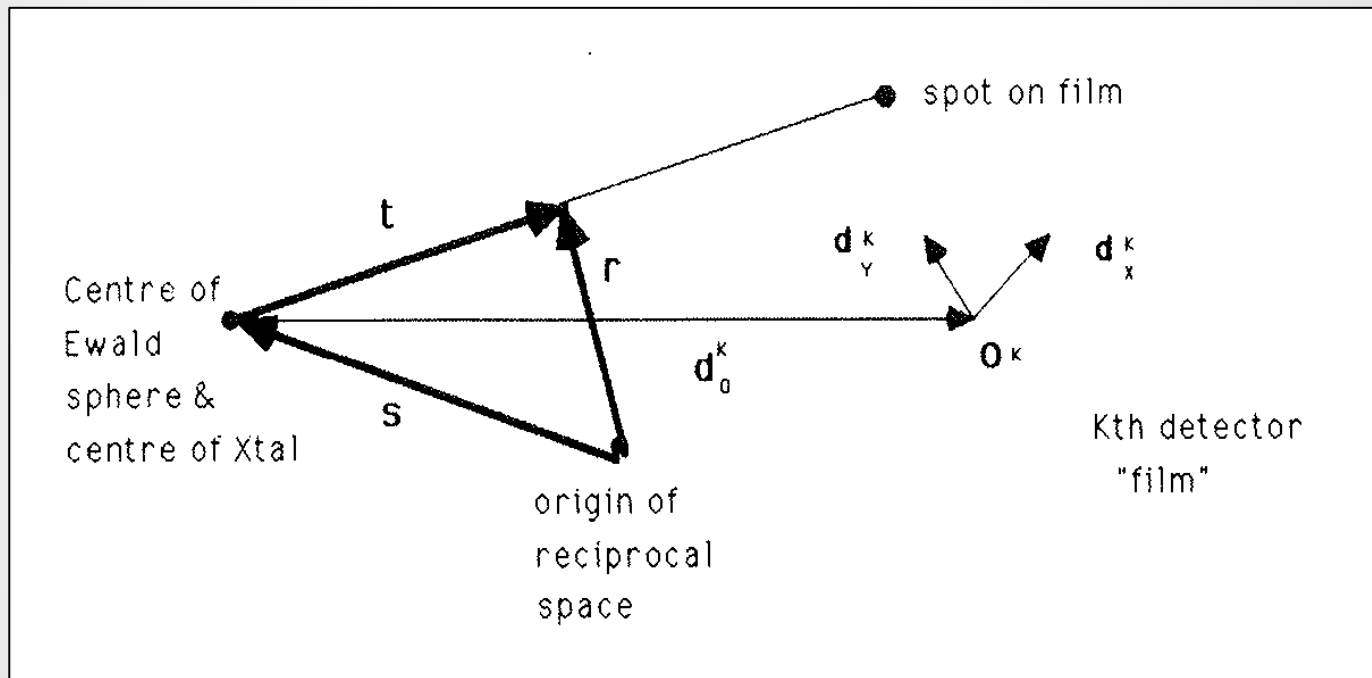


*cf. EVAL package
J. Appl. Cryst. **36**, (2003) 220-229



Centroid refinement

- Resembles generalised vector description of MADNES (not by accident)

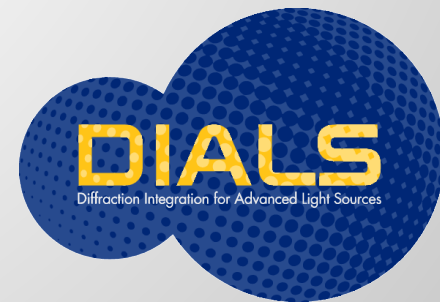
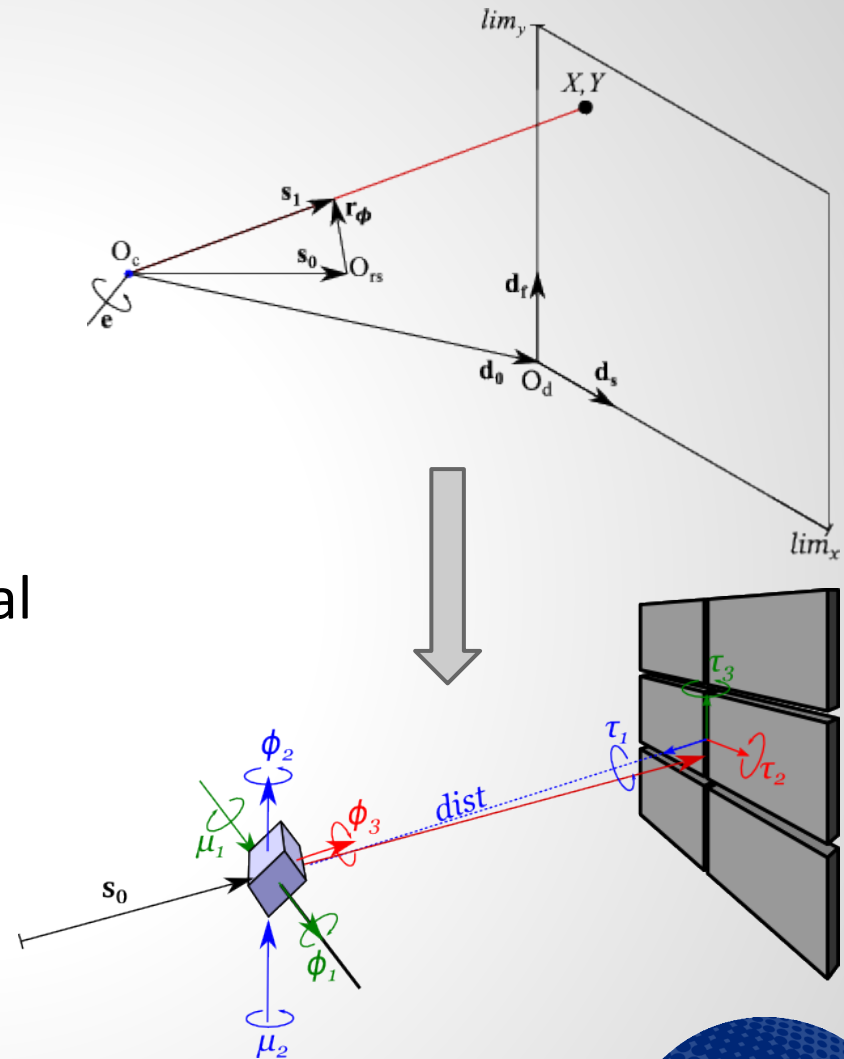


Bricogne, G (1987) *Proc. CCP4 Daresbury Study Weekend*

Various authors (1986) *Proc. EEC Cooperative Workshop on Position Sensitive Detector Software I-III*

Parameterisation

- Prediction equation parameterisation:
- Calculate (X, Y, ϕ) & $\left(\frac{\partial X}{\partial p}, \frac{\partial Y}{\partial p}, \frac{\partial \phi}{\partial p}\right)$ for an abstract parameter p
- Implement **p** suitable for typical rotation method experiment



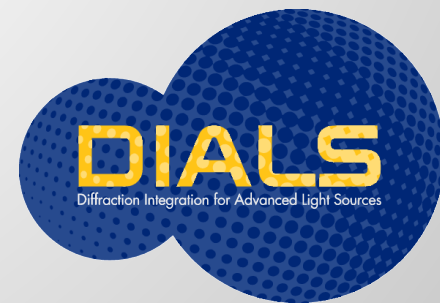
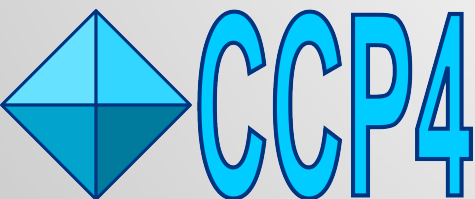
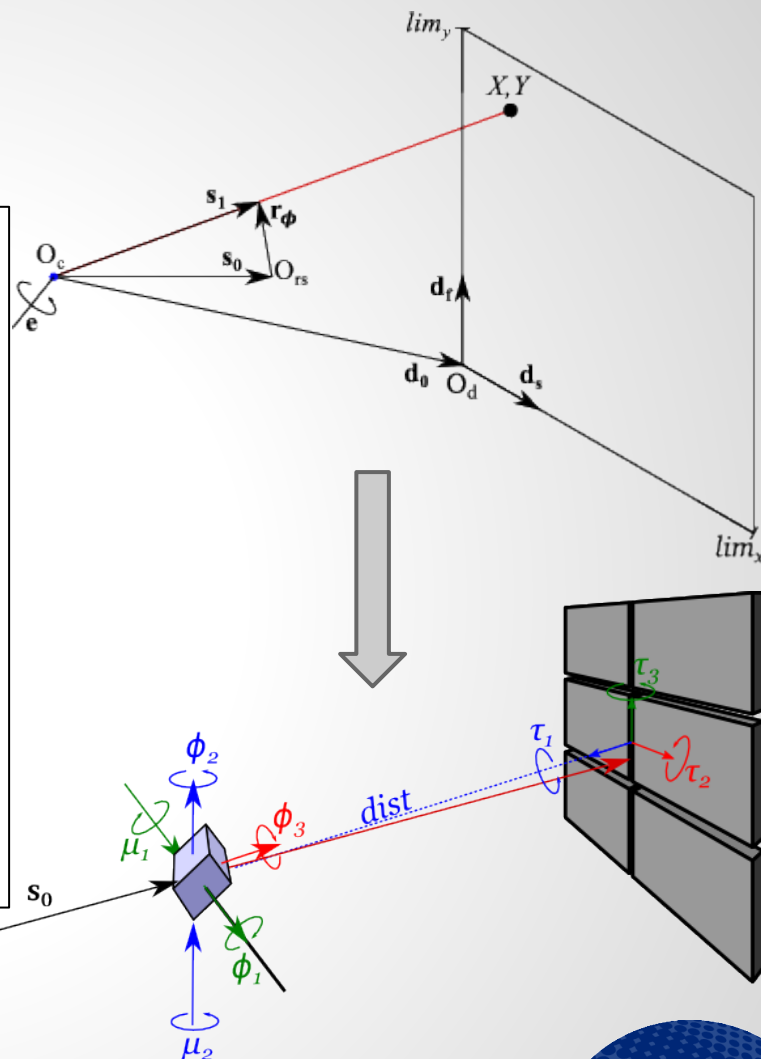
Parameterisation

There are 18 parameters in the $P1$ case:

Table 1. *Default parameterisation in dials.refine for scan-static refinement using a single*

Parameterisation	Model state	Parameters	Action
Beam	s_0	μ_1	rotation about initial $\hat{\mu}_2 \times \hat{s}_0$
		μ_2	rotation about initial $\hat{s}_0 \times \hat{e}$
		ν	set length of s_0 (wavenumber)
Crystal orientation	U	ϕ_1	rotation about laboratory X
		ϕ_2	rotation about laboratory Y
		ϕ_3	rotation about laboratory Z
Crystal unit cell	B	g_{11}^*	set metrical matrix elements
		g_{22}^*	
		g_{33}^*	
		g_{12}^*	
		g_{13}^*	
		g_{23}^*	
Detector	d	p_0	set distance along initial $\hat{d}_f \times \hat{d}_s$
		t_1	translation along initial $\hat{d}_f$
		t_2	translation along initial $\hat{d}_s$
		τ_1	rotation about initial $\hat{d}_f \times \hat{d}_s$
		τ_2	rotation about initial $\hat{d}_f$
		τ_3	rotation about initial $\hat{d}_s$

Usually ν and μ_1 are fixed



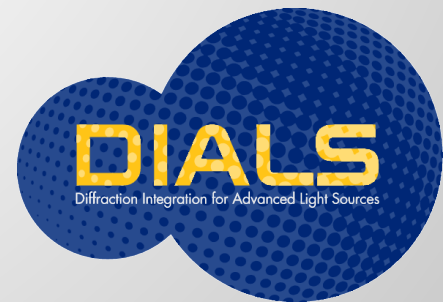
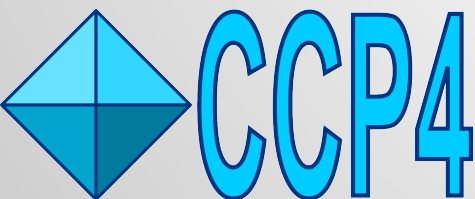
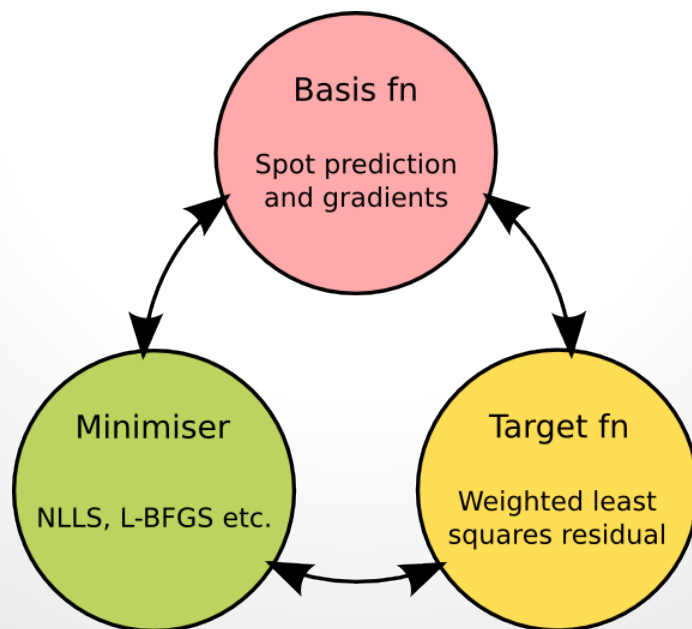
Modularity

We approach this as a traditional non-linear least squares problem (no reason not to - it works well for other programs)

$$L = \frac{1}{2} \sum_{i=1}^n w_{i,X} (X - X_{\text{obs}})^2 + w_{i,Y} (Y - Y_{\text{obs}})^2 + w_{i,\phi} (\phi - \phi_{\text{obs}})^2$$

$$\frac{\partial L}{\partial p} = \sum_{i=1}^n w_{i,X} \frac{\partial X}{\partial p} (X - X_{\text{obs}}) + w_{i,Y} \frac{\partial Y}{\partial p} (Y - Y_{\text{obs}}) + w_{i,\phi} \frac{\partial \phi}{\partial p} (\phi - \phi_{\text{obs}})$$

However, taking heed of Phil Evans' advice we keep things flexible

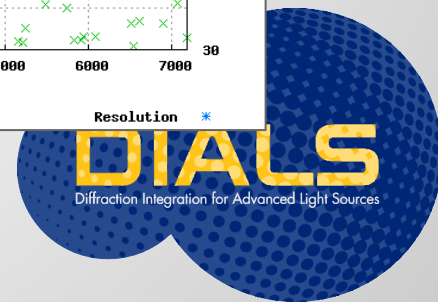
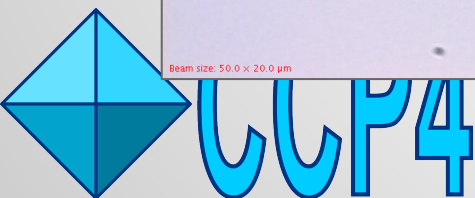
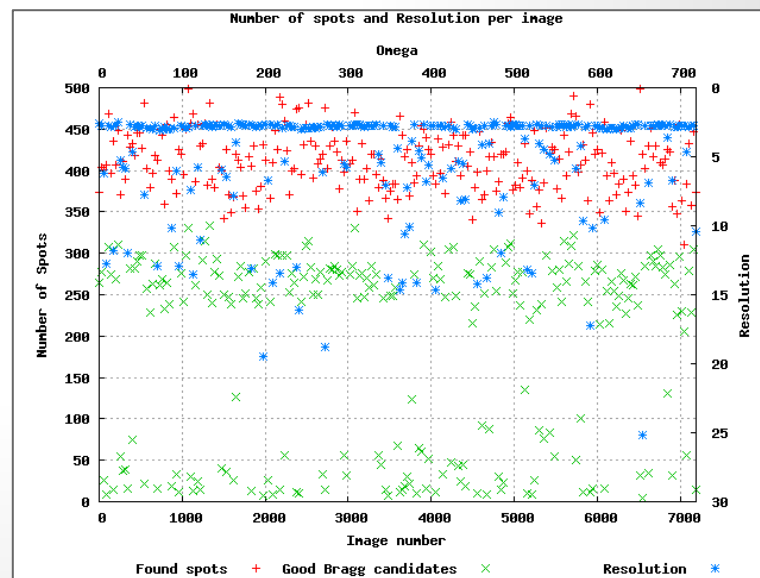


Scan-varying refinement

- We do global, not local, refinement
- How to model changes to the crystal model over time?

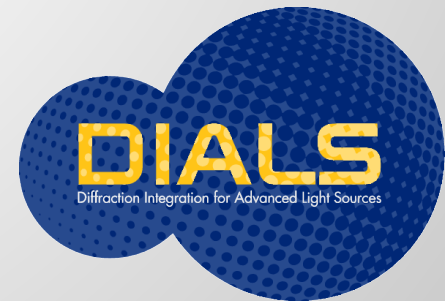
Example

- 720° of tetragonal thaumatin data collected at 0.1°/image, 40Hz, 3% transmission at DLS I03

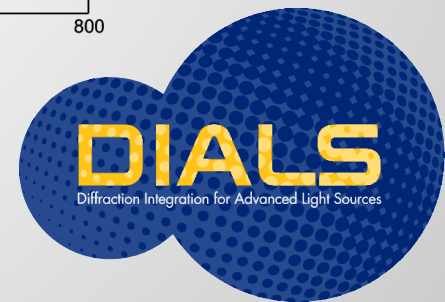
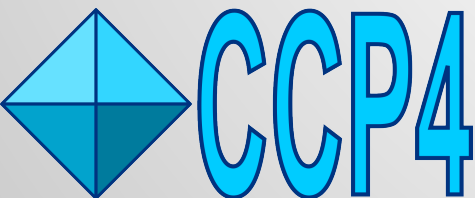
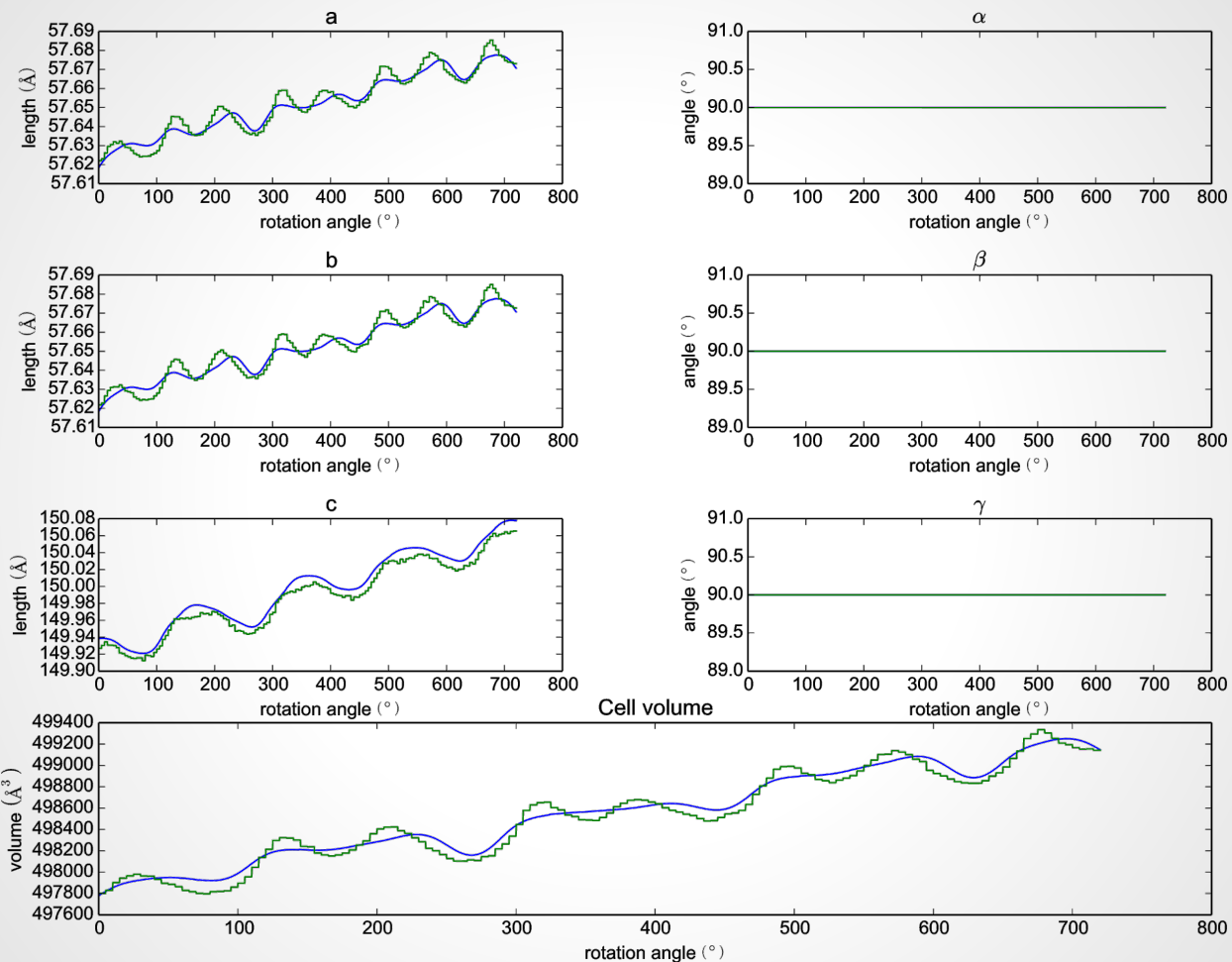


Scan-varying refinement

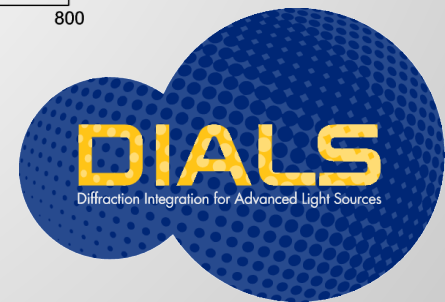
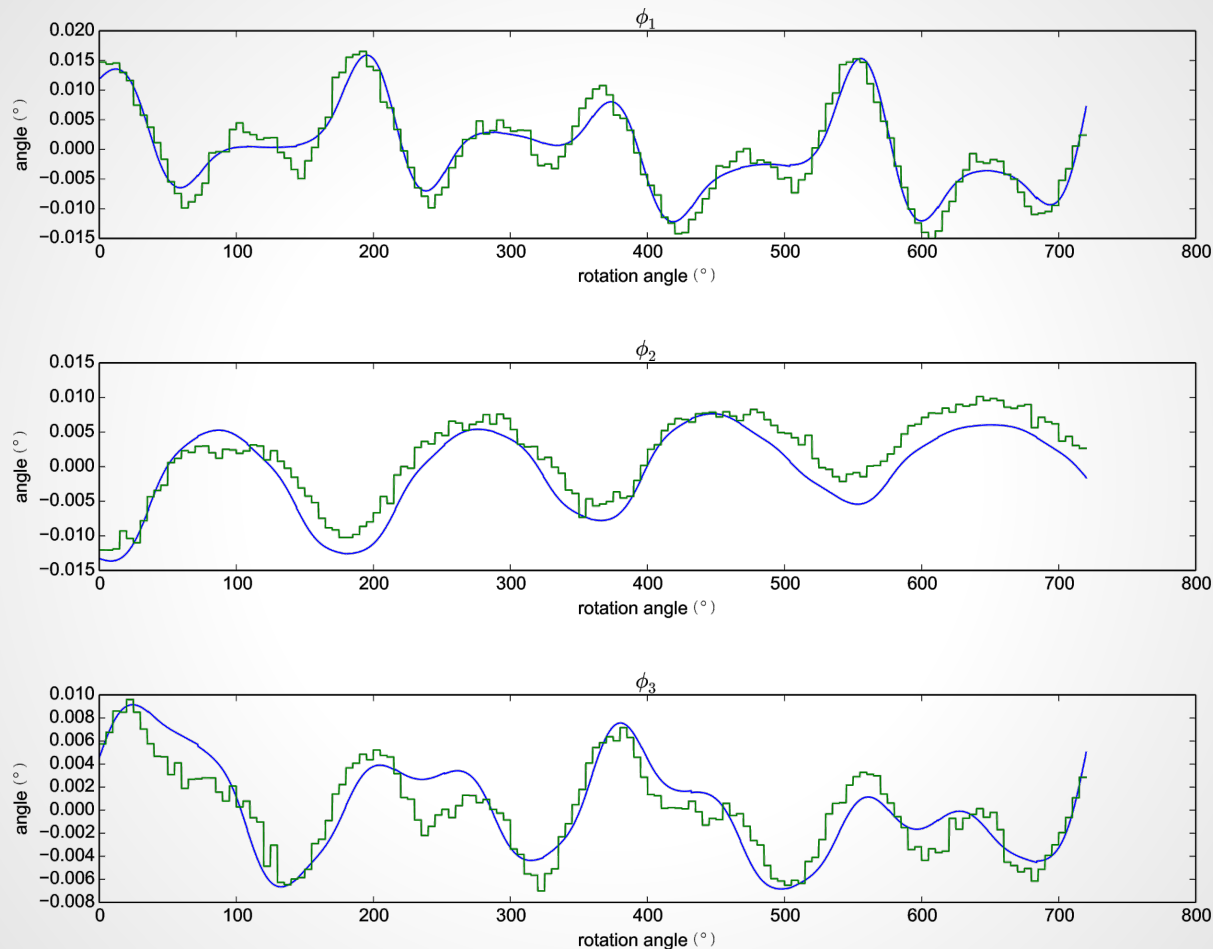
- Scan divided into equal-sized intervals
- Crystal parameterisation split over sample points
- Gaussian smoother, inspired by AIMLESS
- 117 parameters:
 - 6 detector
 - 1 beam
 - 3 crystal orientation $\times$ 22 "samples"
 - 2 unit cell parameters $\times$ 22 "samples"



Scan-varying refinement

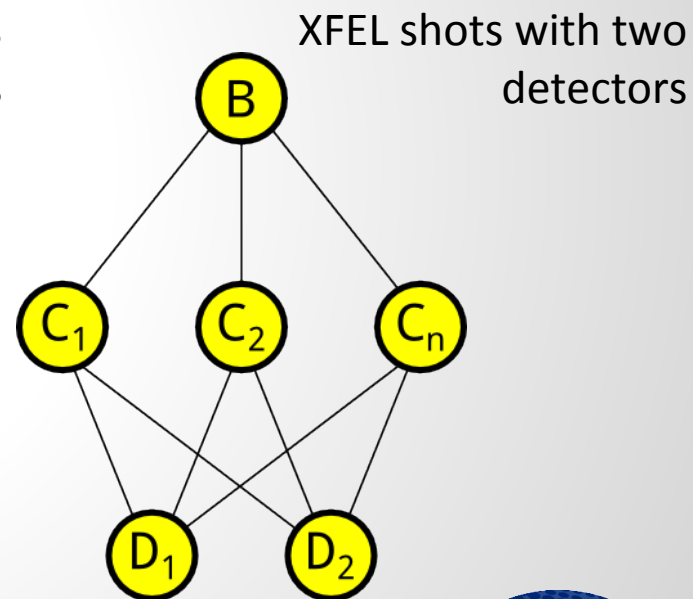
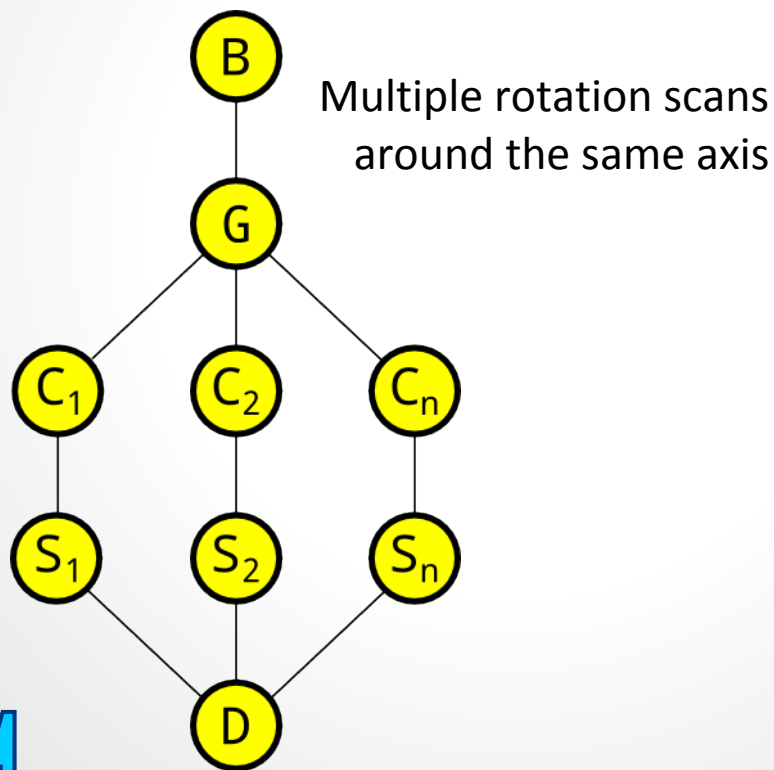


Scan-varying refinement



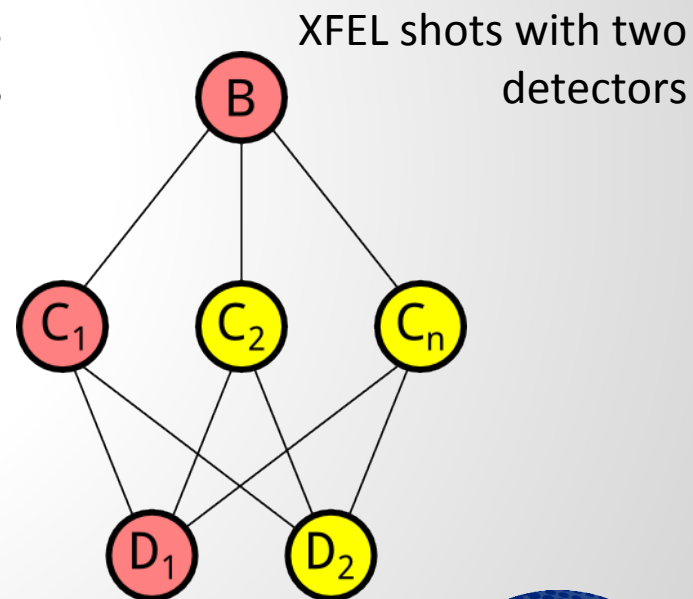
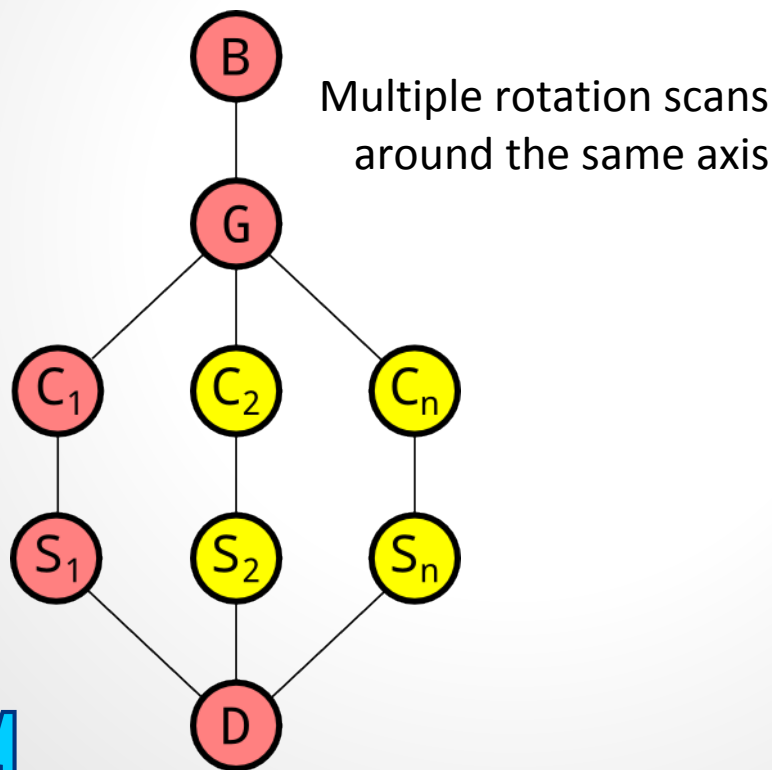
Multiple Experiments

- Global refinement across datasets that share some models
- Typical use cases involve multiple crystals



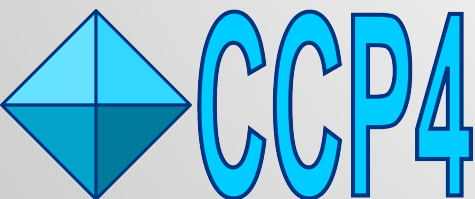
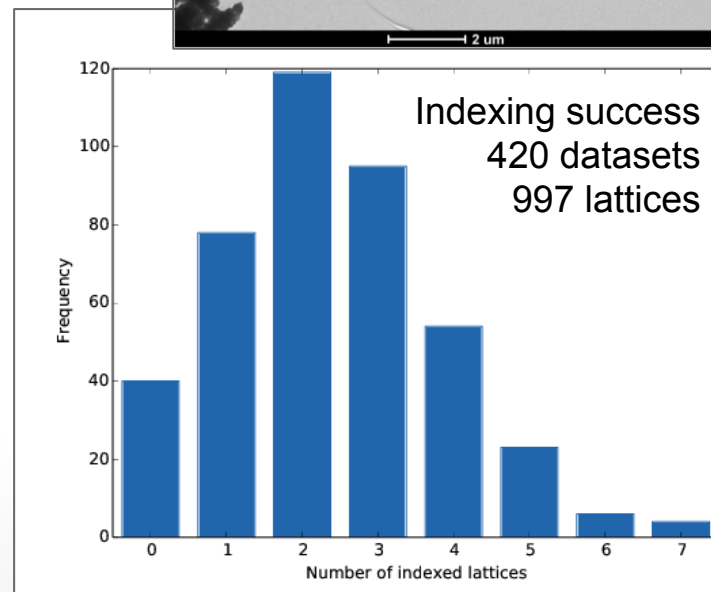
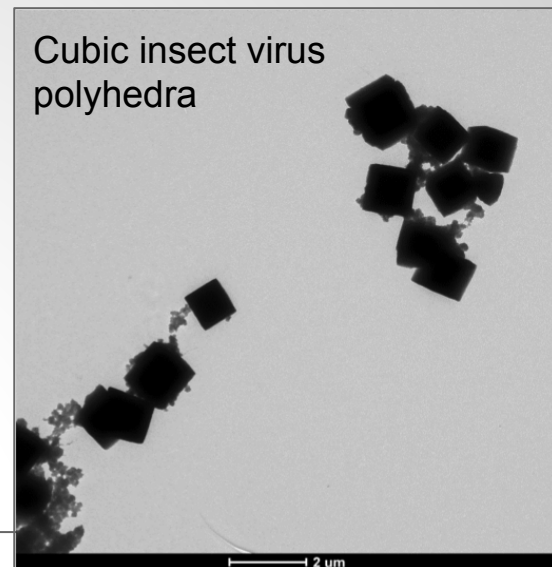
Multiple Experiments

- Global refinement across datasets that share some models
- Typical use cases involve multiple crystals



Multiple Experiments

- *DIALS* contains an indexing algorithm that is very successful at identifying multiple lattices*
- This even works when lattices diffract equally well, and only a narrow wedge of data is available
- As additional lattices are found, joint refinement reduces correlations between crystal and detector parameters

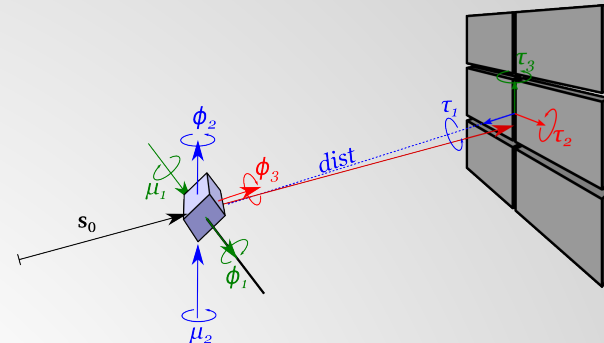


*Gildea et al. (2014) *Acta Crystallogr. D Biol. Crystallogr.* **70**, 2652-66



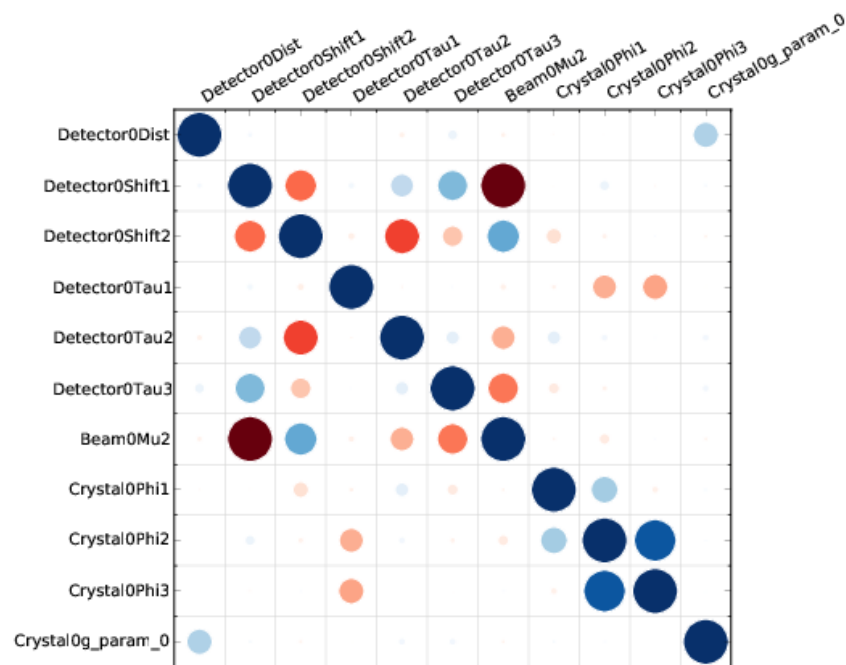
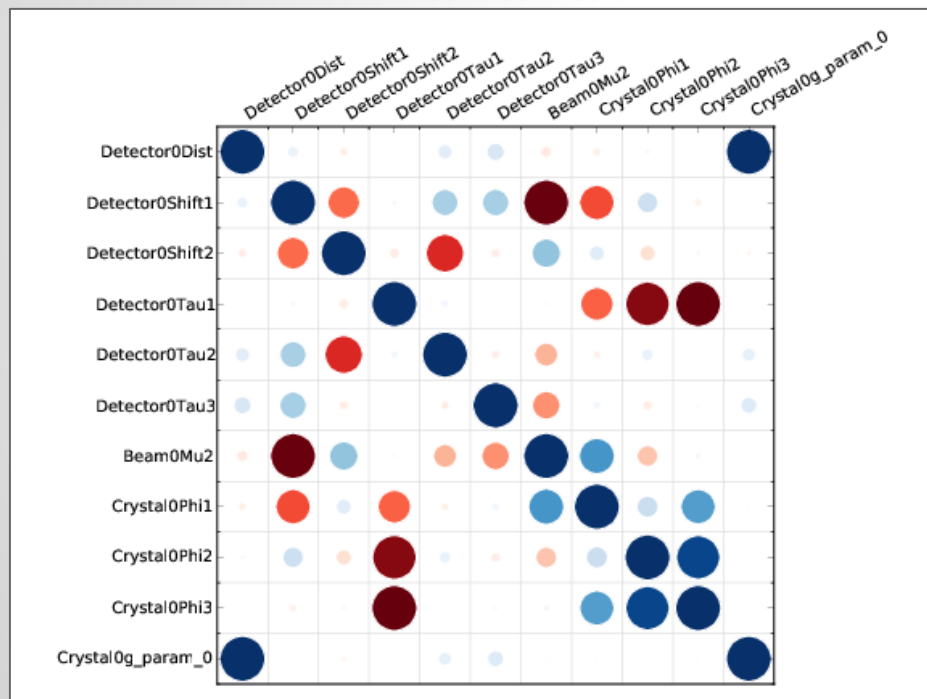
Multiple Experiments

Cubic polyhedrin crystals, 1° scans



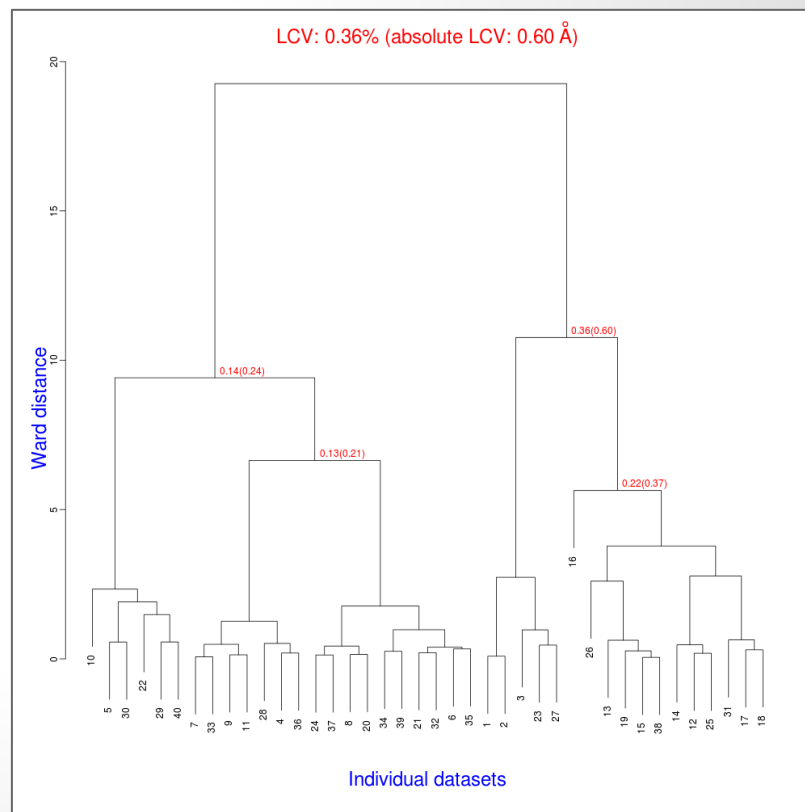
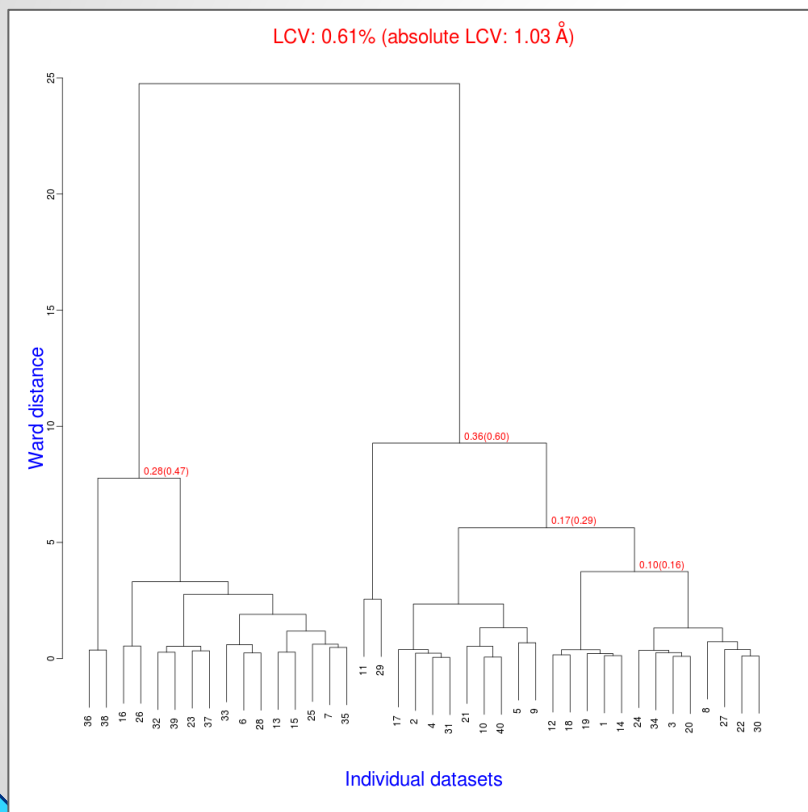
One lattice

5 sweeps (16 lattices)



Multiple Experiments

- We are investigating the use of joint refinement as a preparatory step for *BLEND*



TehA data. See forthcoming *Acta Cryst. D71* (June 2015) for original analysis

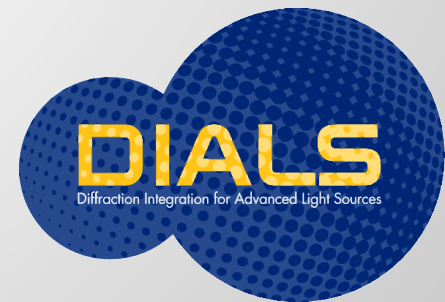


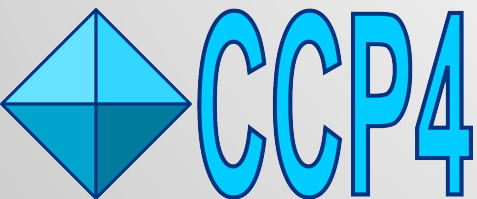
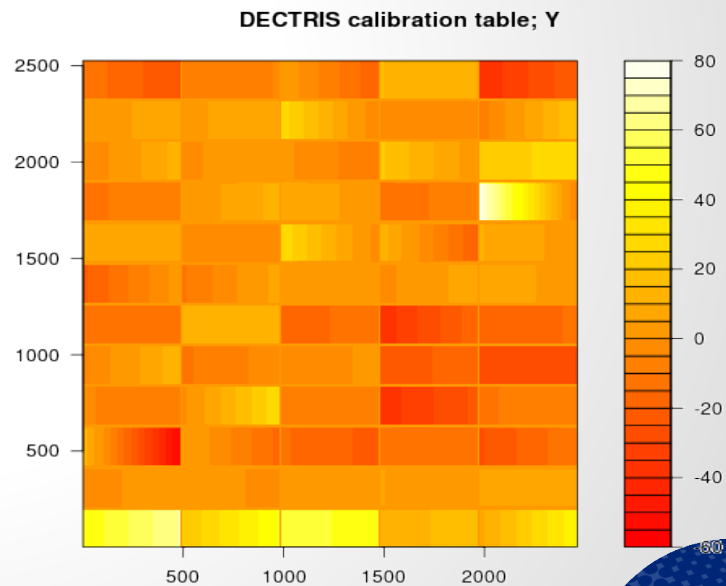
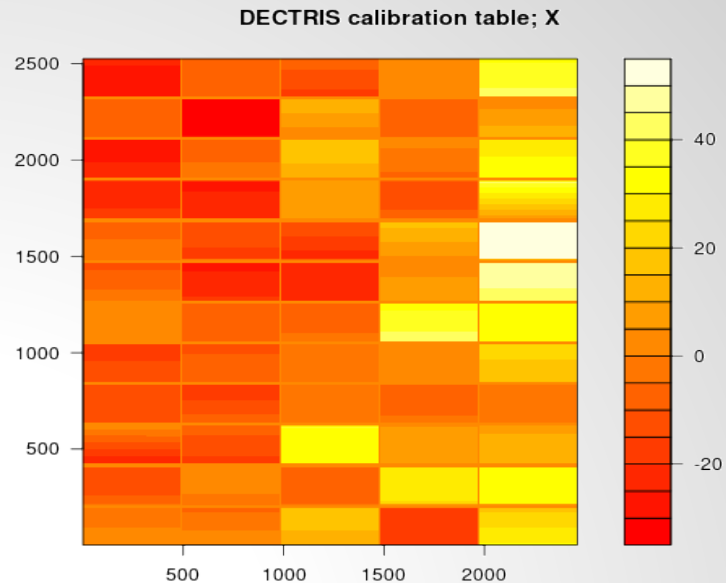
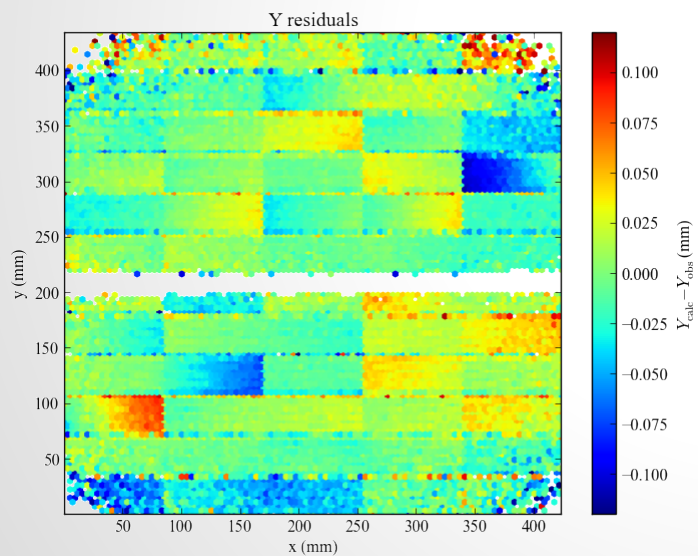
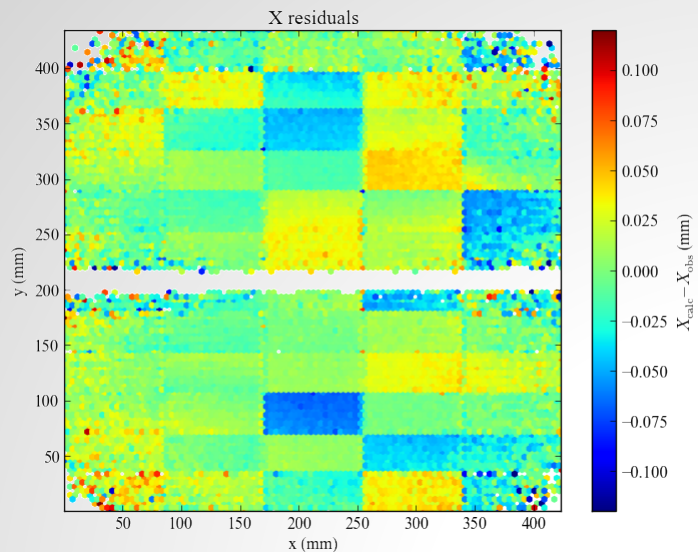
Multi-tile detector metrology

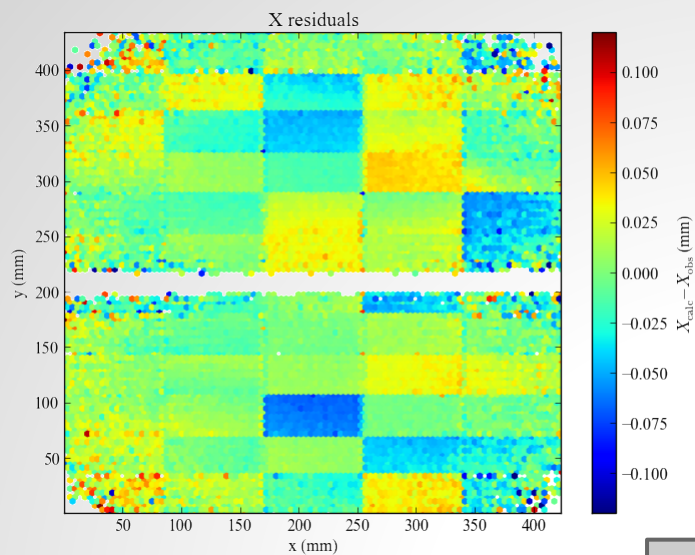
- DECTRIS Pilatus PADs are extremely well-made
- The spatial calibration of panels is measured at the factory
- Correction tables are supplied with the detector
- However, *we don't typically use this information for MX*
- Nevertheless its effect is detectable in processed data

Example

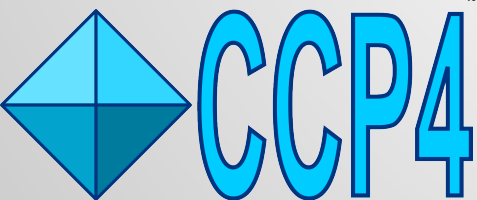
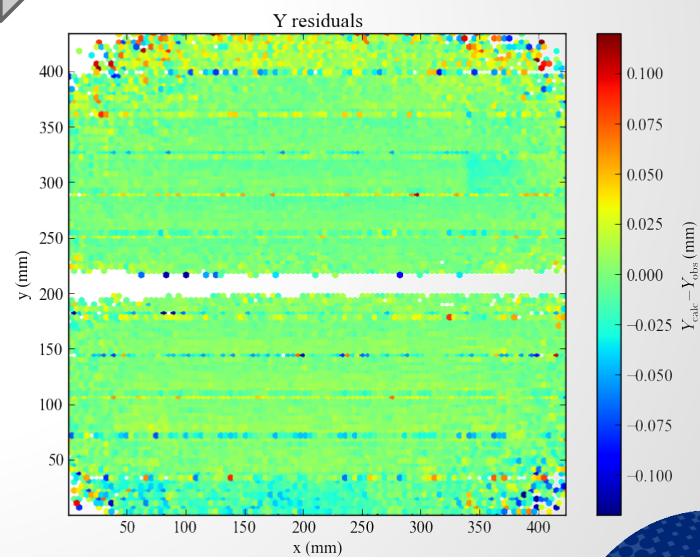
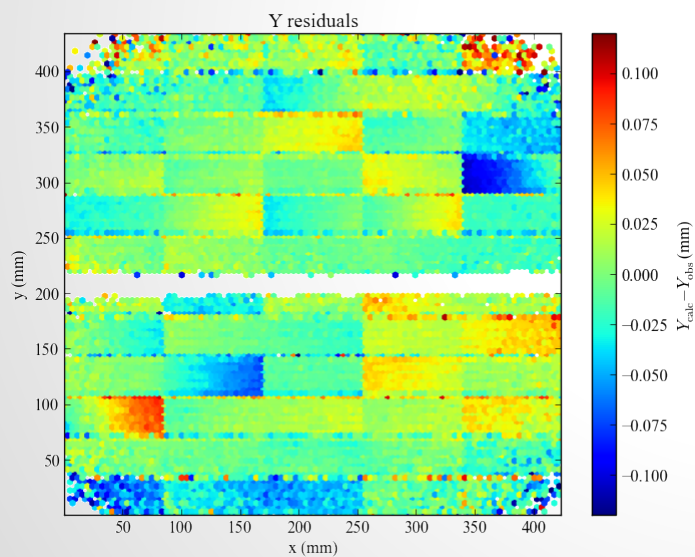
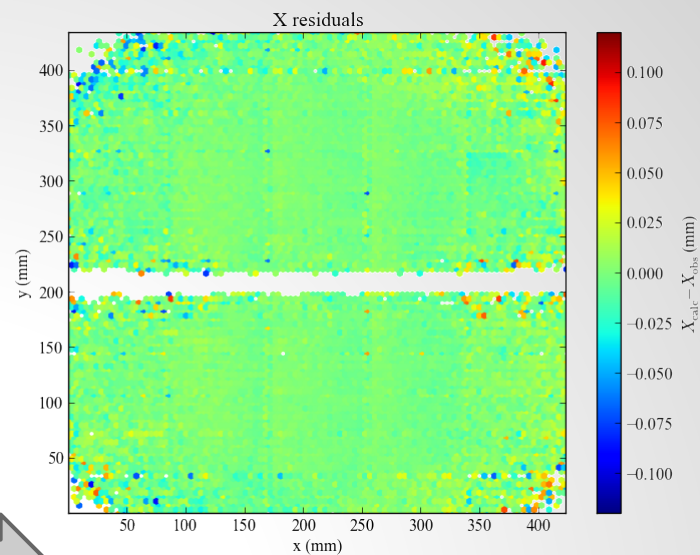
- 720° of thaumatin data collected at 0.1°/image, 40Hz, 3% transmission at DLS I03
- diffraction to 1.8 Å in the corners





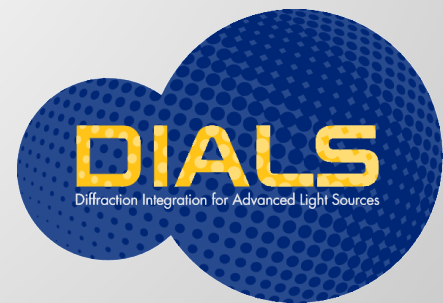
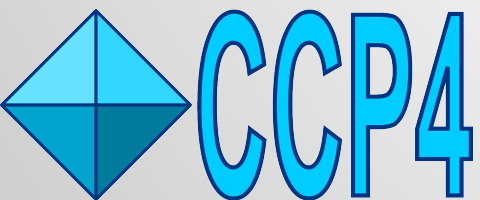
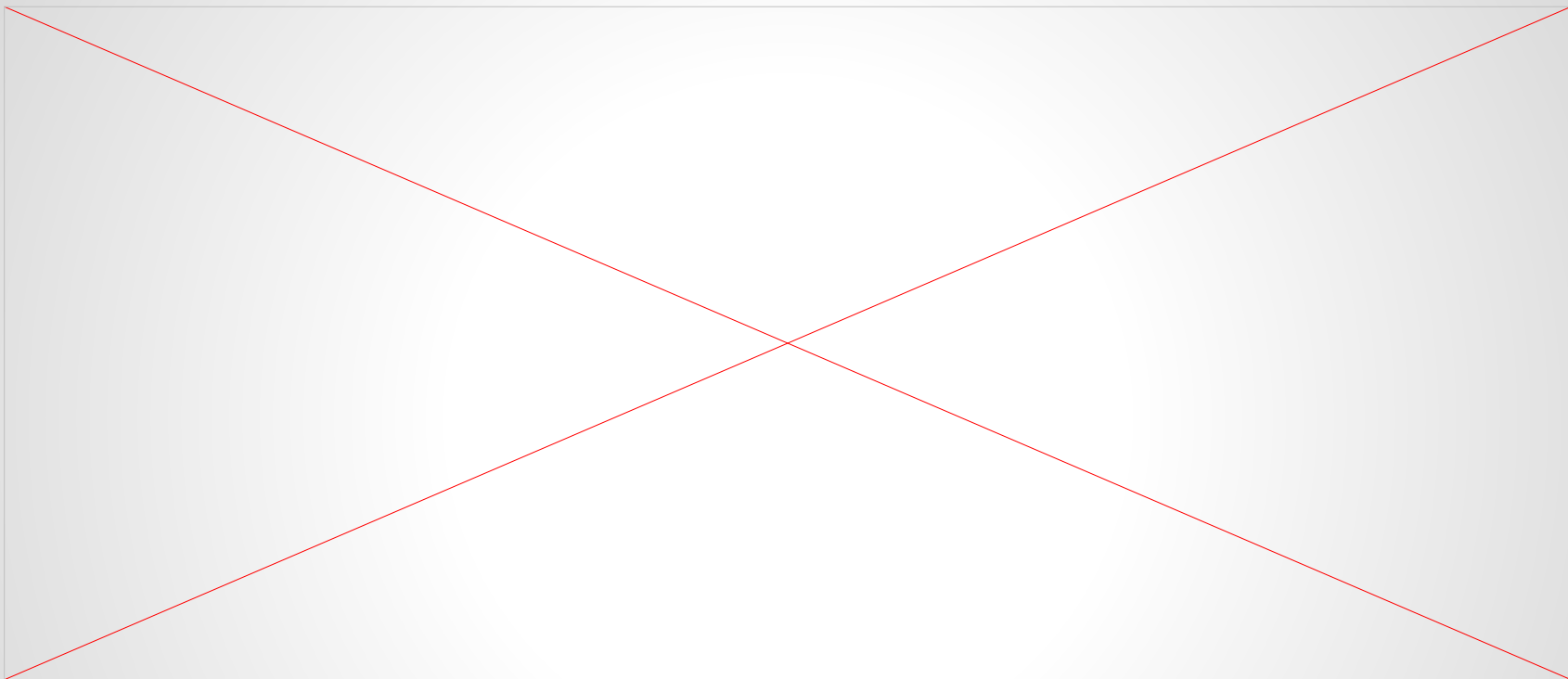


refinement

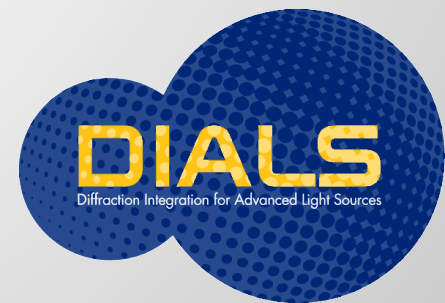
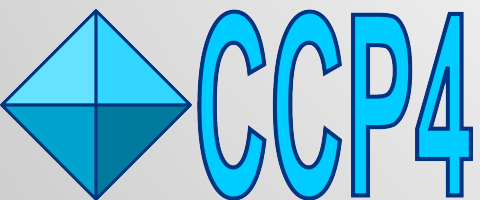
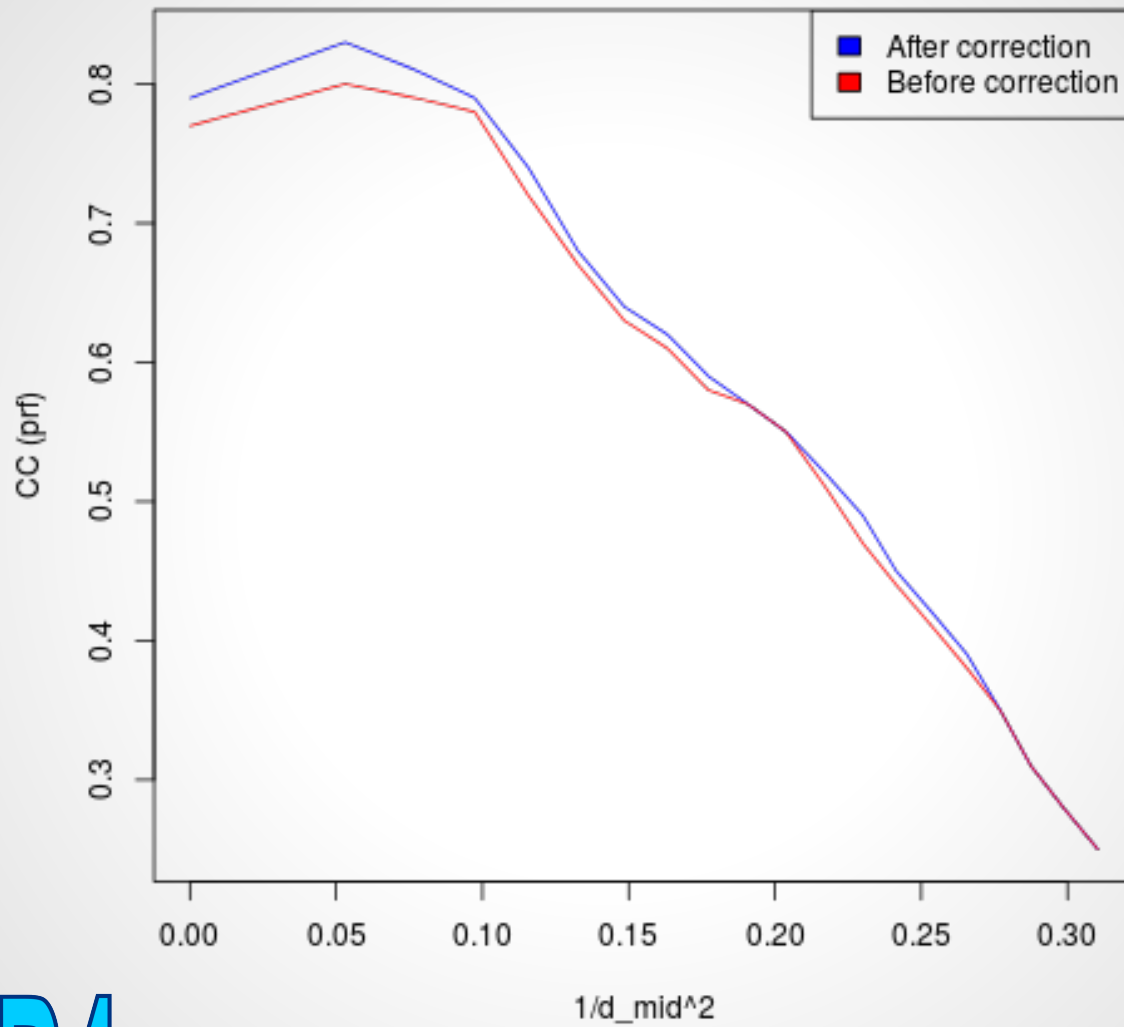


Before correction

After correction



CC (prf) vs. resolution

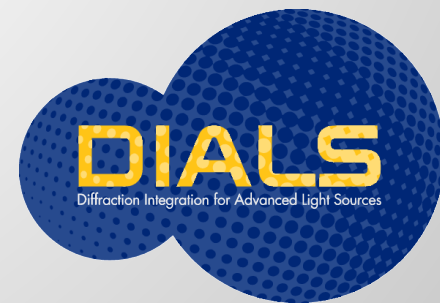
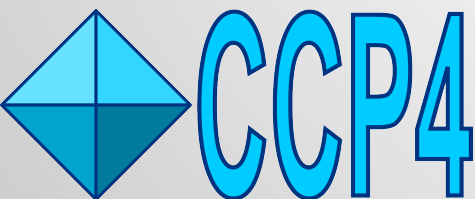


Before correction

	Overall	InnerShell	OuterShell
Low resolution limit	150.00	150.00	1.83
High resolution limit	1.79	8.97	1.79
Rmerge (within I+/I-)	0.057	0.036	0.147
Rmerge (all I+ and I-)	0.058	0.037	0.169
Rmeas (within I+/I-)	0.059	0.037	0.190
Rmeas (all I+ & I-)	0.059	0.038	0.195
Rpim (within I+/I-)	0.013	0.007	0.118
Rpim (all I+ & I-)	0.009	0.006	0.094
Rmerge in top intensity bin	0.036	-	-
Total number of observations	631003	9164	594
Total number unique	18352	271	147
Mean((I)/sd(I))	48.7	69.4	7.5
Mn(I) half-set correlation CC(1/2)	1.000	1.000	0.948
Completeness	74.4	99.9	10.7
Multiplicity	34.4	33.8	4.0
Anomalous completeness	73.7	100.0	8.6
Anomalous multiplicity	18.3	25.0	2.3
DelAnom correlation between half-sets	0.054	0.563	-0.182
Mid-Slope of Anom Normal Probability	1.047	-	-

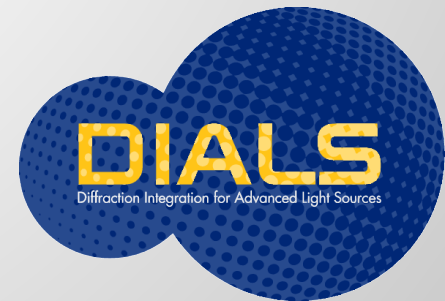
After correction

	Overall	InnerShell	OuterShell
Low resolution limit	150.00	150.00	1.83
High resolution limit	1.79	8.97	1.79
Rmerge (within I+/I-)	0.057	0.037	0.154
Rmerge (all I+ and I-)	0.058	0.037	0.173
Rmeas (within I+/I-)	0.059	0.037	0.198
Rmeas (all I+ & I-)	0.059	0.038	0.198
Rpim (within I+/I-)	0.013	0.007	0.121
Rpim (all I+ & I-)	0.009	0.006	0.094
Rmerge in top intensity bin	0.036	-	-
Total number of observations	631669	9225	601
Total number unique	18355	271	147
Mean((I)/sd(I))	48.7	69.6	7.5
Mn(I) half-set correlation CC(1/2)	1.000	1.000	0.959
Completeness	74.5	99.9	10.7
Multiplicity	34.4	34.0	4.1
Anomalous completeness	73.7	100.0	8.6
Anomalous multiplicity	18.3	25.3	2.4
DelAnom correlation between half-sets	0.059	0.394	-0.237
Mid-Slope of Anom Normal Probability	1.045	-	-



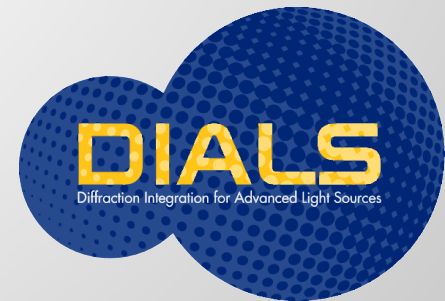
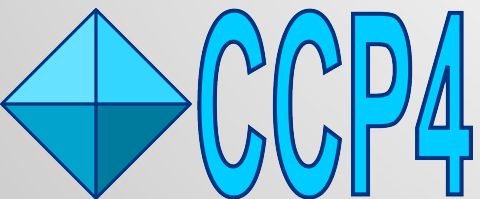
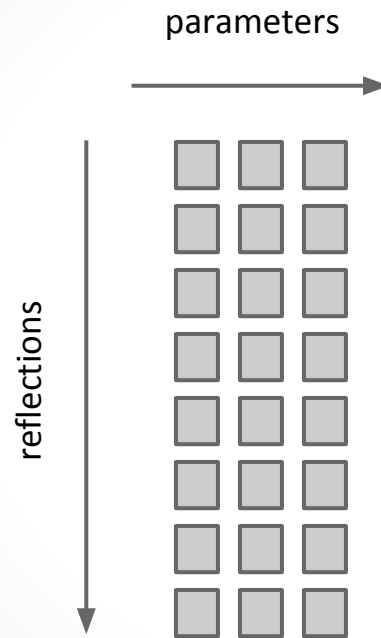
Tools for large refinement jobs

- Normal matrix methods scale as $O(mn^2)$
- The defaults of *dials.refine* are not well-suited to large jobs
- Two approaches
 1. Use a quasi-Newton method such as L-BFGS
 2. Partition the problem: hybrid Refiner
- Note that gradient calculations are expensive, but calculations per reflection are independent
- *dials.refine* optionally allows the use of a memory-efficient L-BFGS engine with gradient calculations in parallel blocks



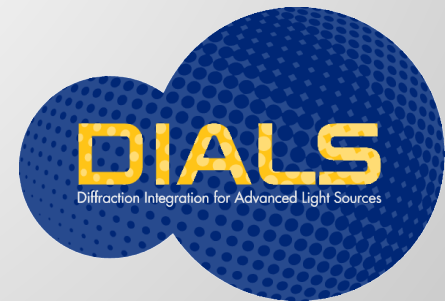
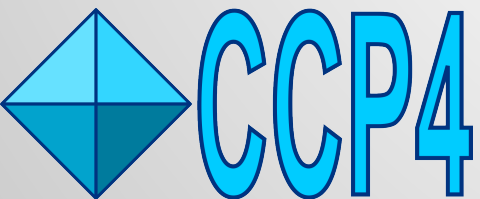
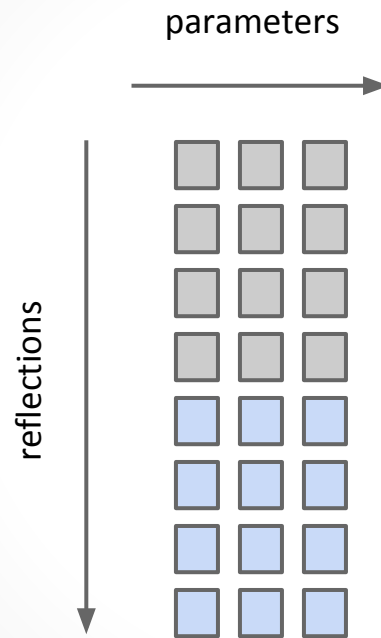
Tools for large refinement jobs

Calculation of the whole Jacobian



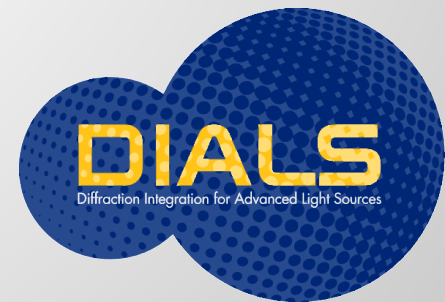
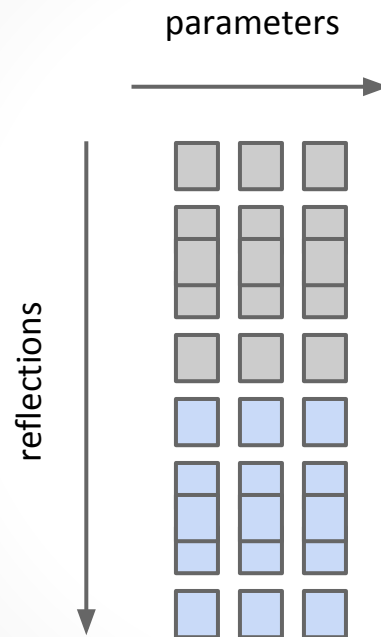
Tools for large refinement jobs

Calculation of the Jacobian in parallel blocks



Tools for large refinement jobs

Calculation of individual dL/dp in parallel (for L-BFGS)

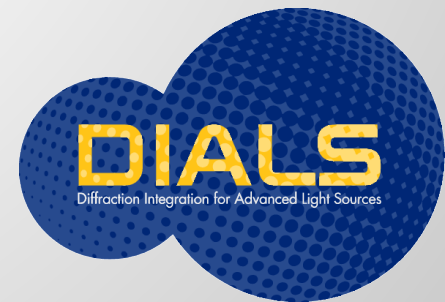


Tools for large refinement jobs

- Only really for the largest jobs
- Each step has a serial component, which is a bottleneck
- The `parallel_map` overhead may be significant
- But we can now tackle large problems with parallel L-BFGS
- Example results for P6M 60 panel metrology:

Engine	nproc	steps	memory	time
LevMar	1	16	2.9 GB	9m59s
LevMar	7	16	~3.4 GB	10m15s
LBFGScurvs	1	119	1.3 GB	22m13s
LBFGScurvs	7	119	?	10m16s

- Need larger jobs still before this starts to shine, such as multi-crystal joint refinement, e.g. XFEL stills



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See Graeme's slides!

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