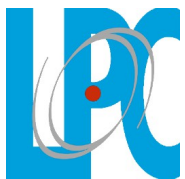


SUGAR : when spectra help standardizing type Ia supernovae



(artist's concept)

E. Gangler and P.-F. Leget
For the SNFactory



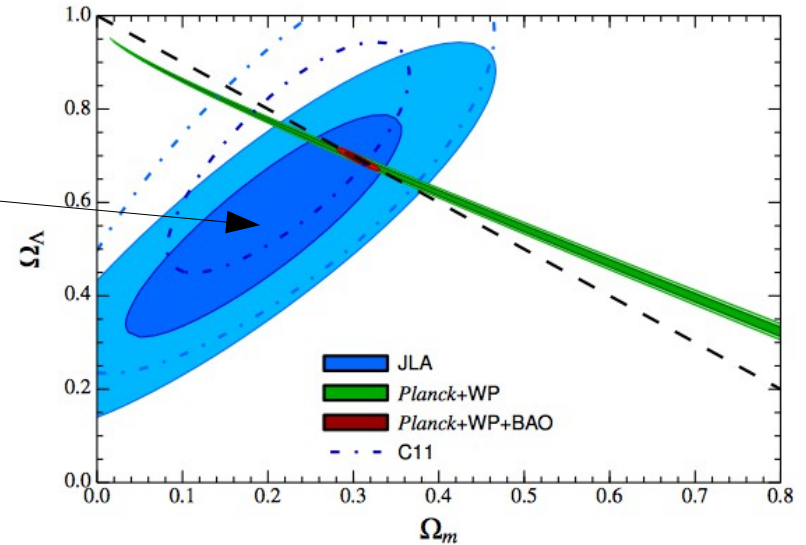
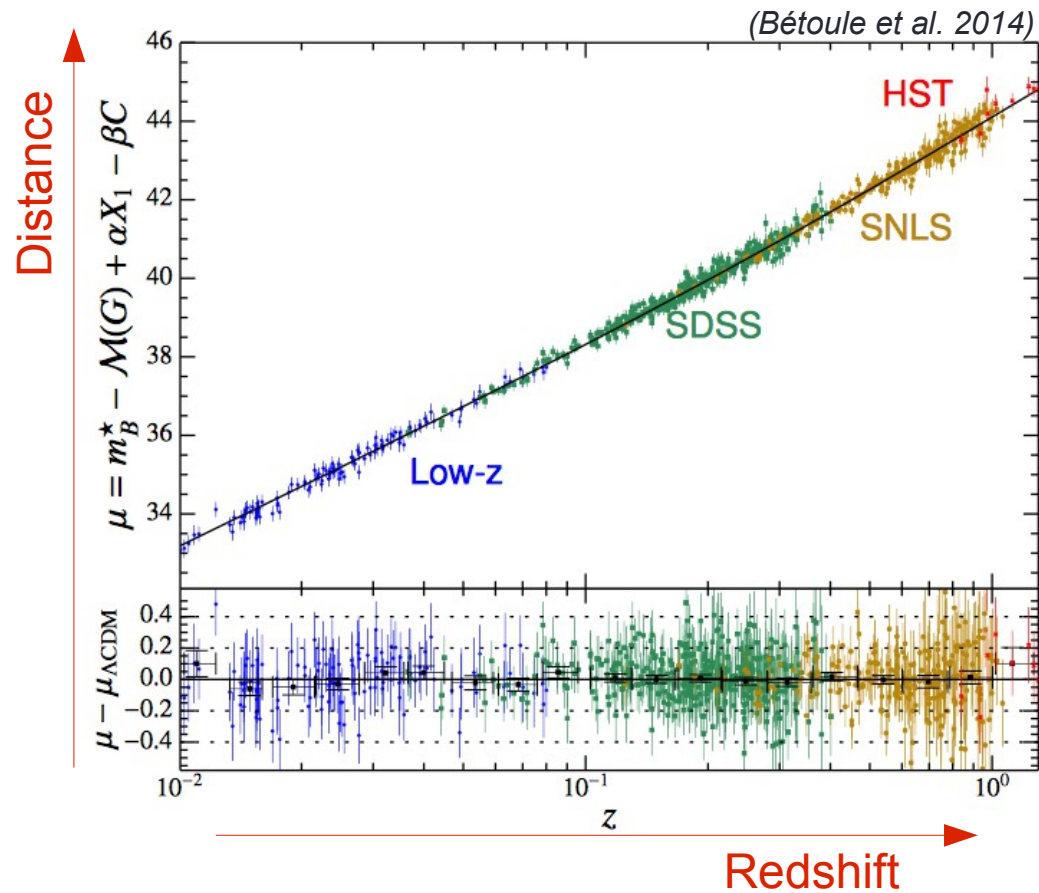
Department of
Physics and Astronomy
University of Bonn



G. Aldering, P. Antilogus, C. Aragon, S. Bailey, C. Baltay, S. Bongard, K. Boone, C. Buton, M. Childress, N. Chotard, Y. Copin, P. Fagrelus, H. K. Fakhouri, U. Feindt, M. Fleury, D. Fouchez, B. Hayden, A. Kim, M. Kowalski, S. Lombardo, J. Nordin, R. Pain, E. Pécontal, R. Pereira, S. Perlmutter, D. Rabinowitz, M. Rigault, K. Runge, D. Rubin, C. Saunders, R. A. Scalzo, G. Smadja, C. Sofiatti, N. Suzuki, C. Tao, R. C. Thomas, B.A. Weaver

SN as standard candles

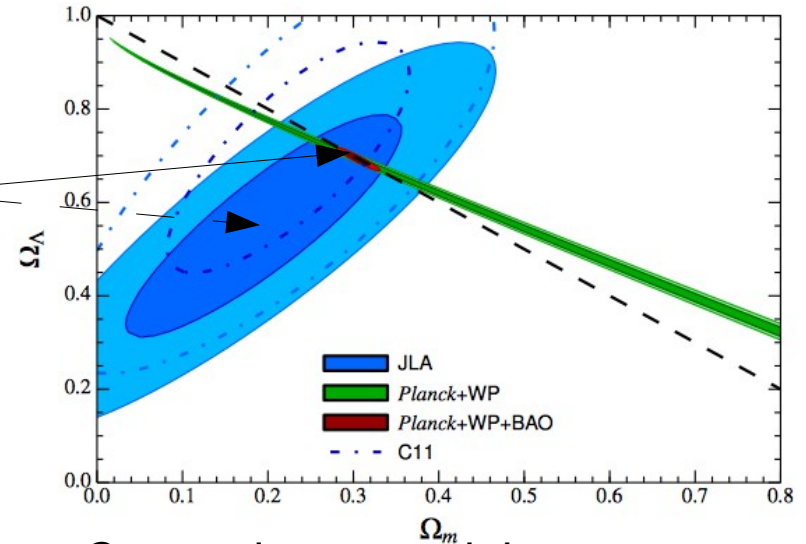
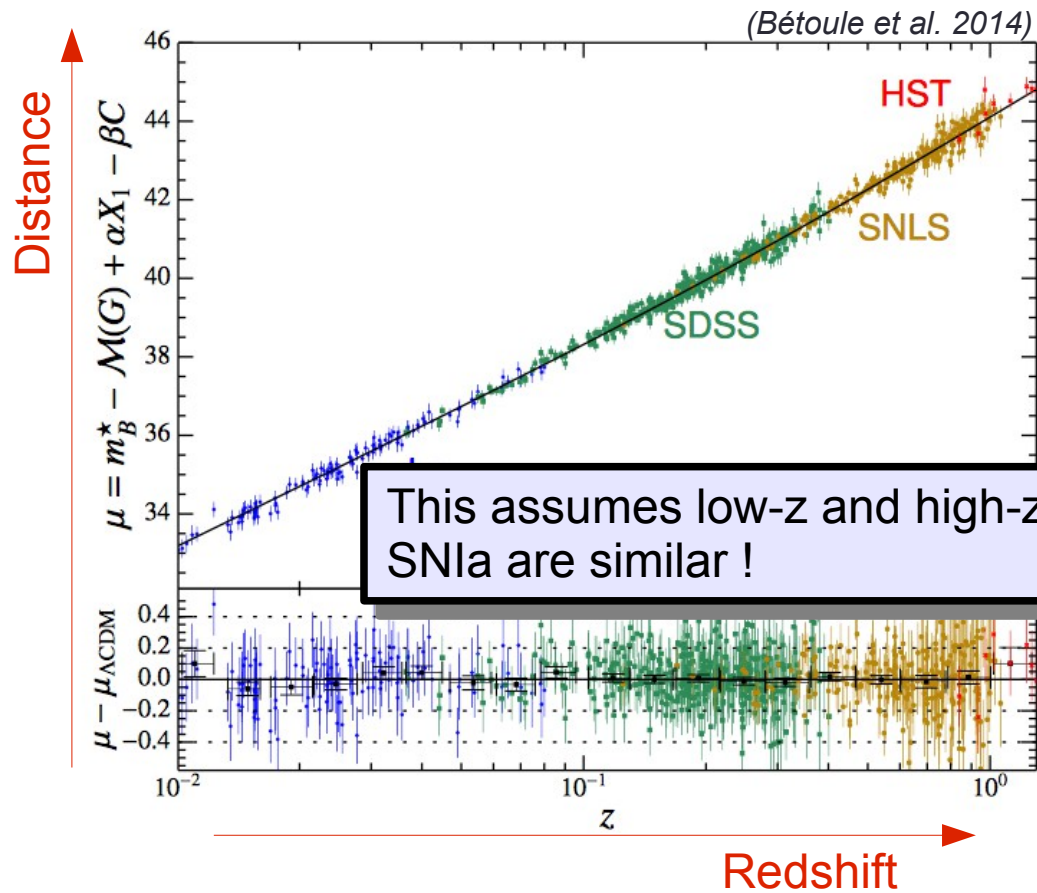
Fit to Hubble diagram
→ cosmological parameters



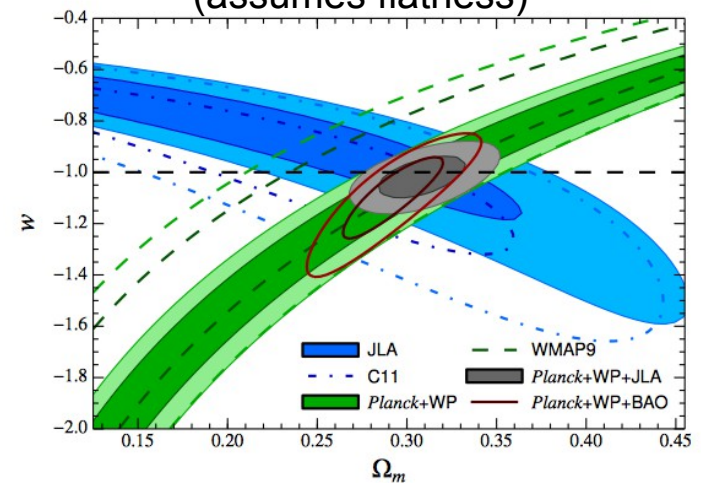
Concordance model :
SN/CMB/BAO → Λ CDM
Probe combination for w

SN as standard candles

Fit to Hubble diagram
 → cosmological parameters



Concordance model :
 SN/CMB/BAO → LCDM
 Probe combination for w
 (assumes flatness)

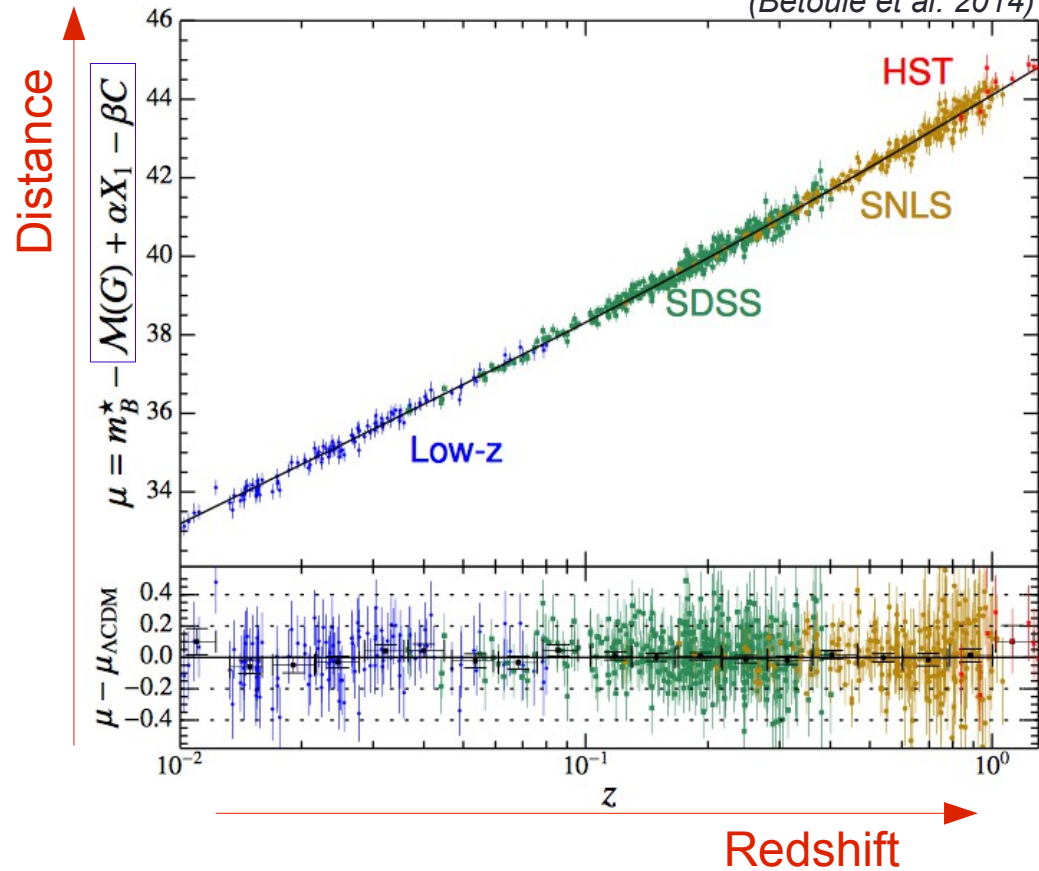


SN as standardizable candles

Fit to Hubble diagram

- cosmological parameters
- **Supernova parameters**

(Bétoule et al. 2014)



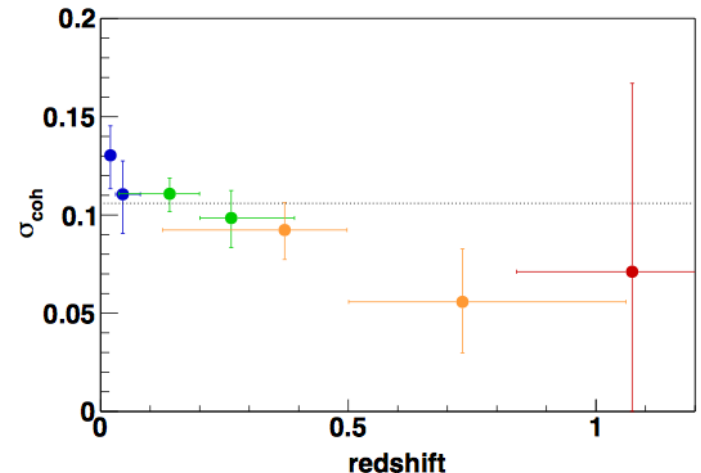
$$\mu = m_B^* - \mathcal{M}(\mathcal{G}) + \alpha X_1 - \beta C$$

Supernova properties impact magnitude

C : Color
 X_1 : Stretch
 Host galaxy

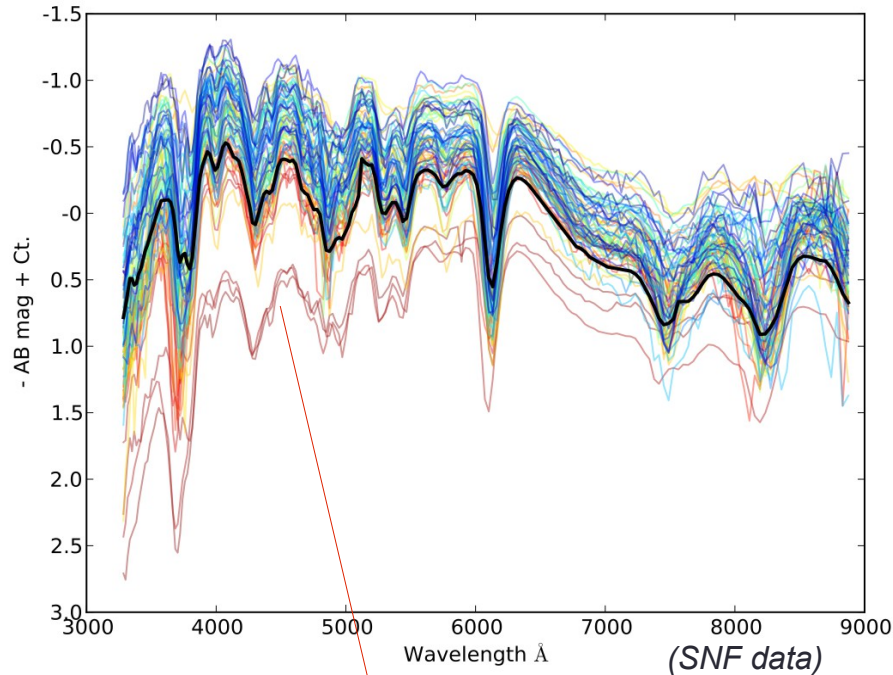
→ **SALT2**

Additional dispersion :
 What we don't control !



SN as standardizable candles

Maximum light spectrum



$$\mu = m_B^* - \mathcal{M}(\mathcal{G}) + \alpha X_1 - \beta C$$

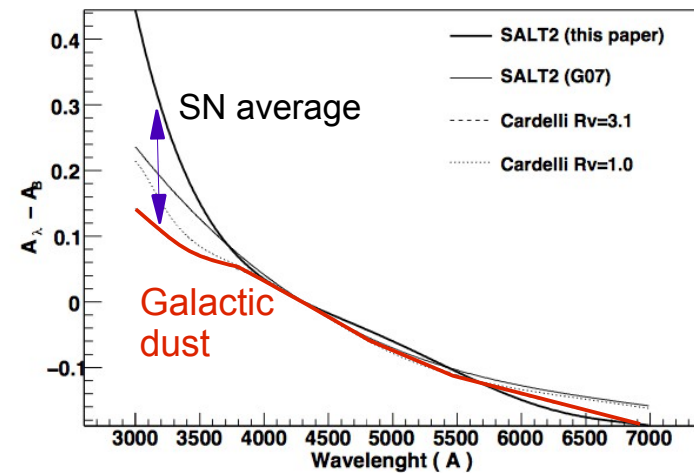
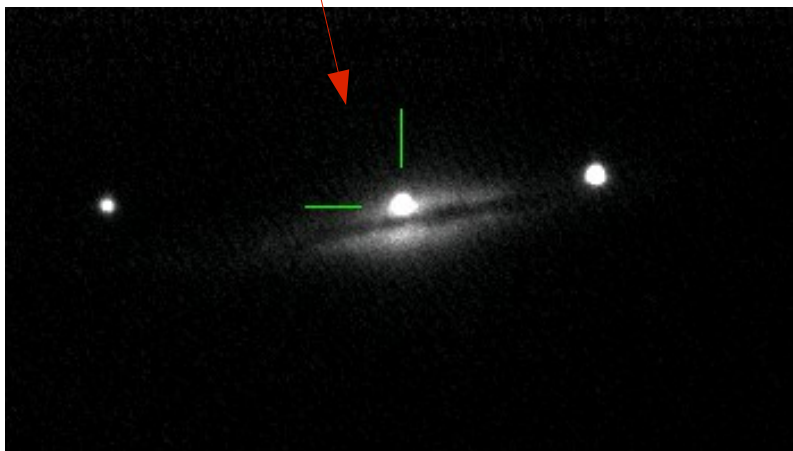
Supernova properties impact magnitude

C : Color

Redder - Fainter relation

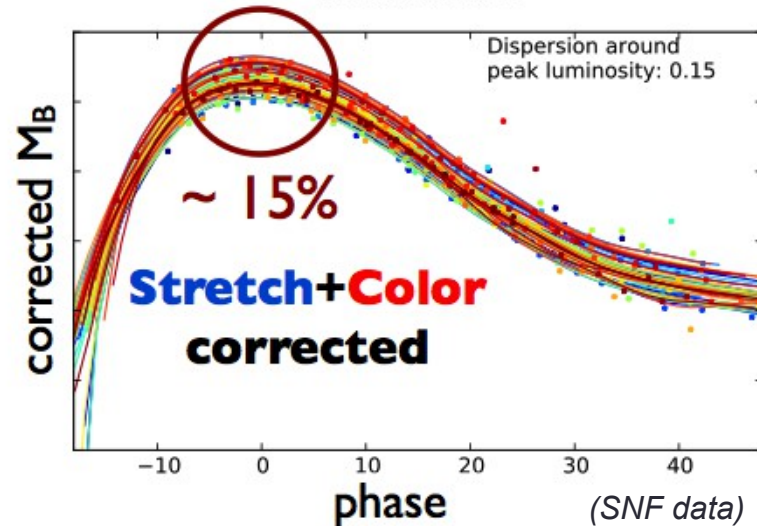
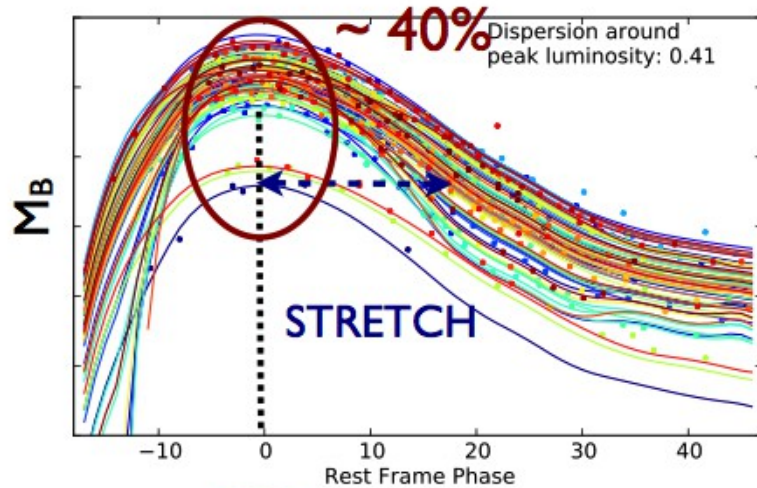
Association with dust

... But average color law departs from reddening by dust (Fitzpatrick or CCM)



(Guy et al. 2010)

SN as standardizable candles



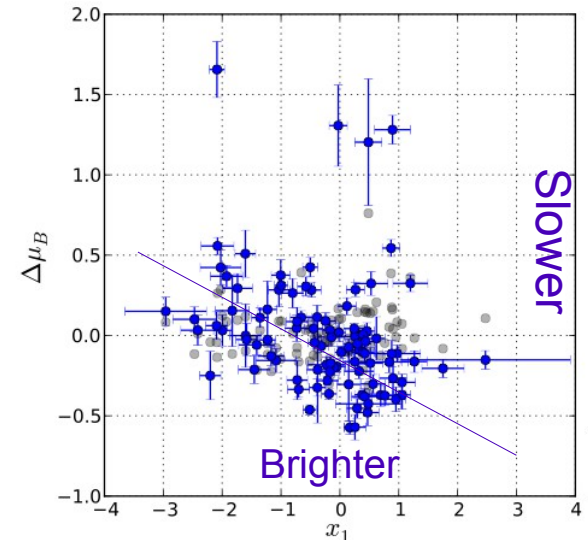
$$\mu = m_B^* - \mathcal{M}(\mathcal{G}) + \alpha X_1 - \beta C$$

Supernova properties impact magnitude

C : Color

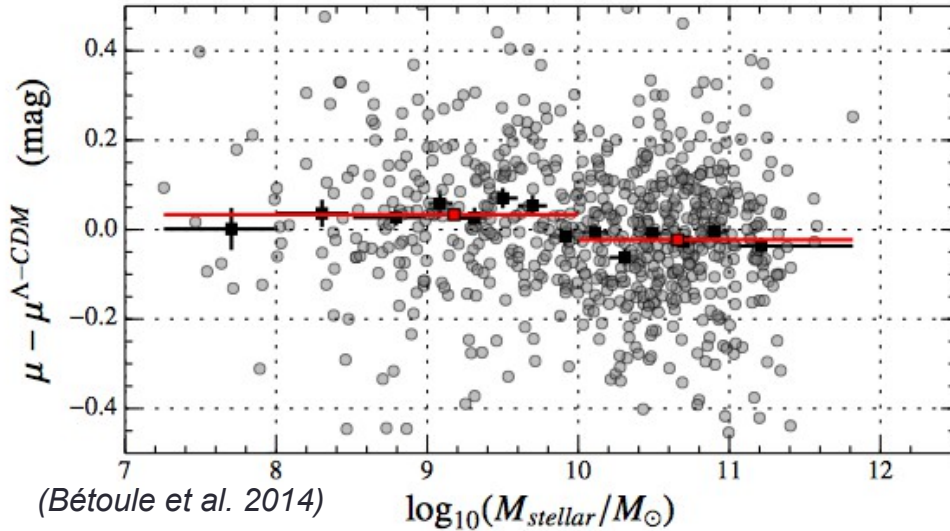
X_1 : Stretch (Brighter-Slower relation)

Physics : opacity / luminosity competition



SN as standardizable candles

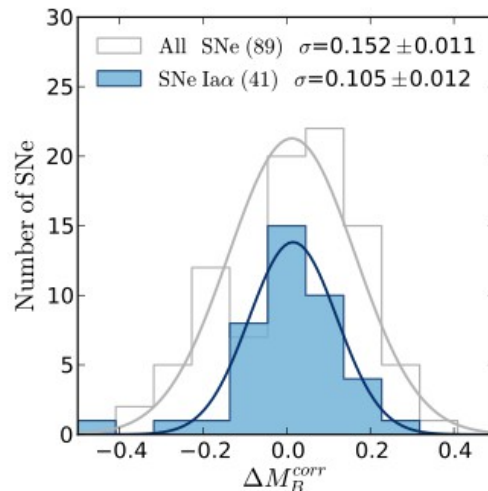
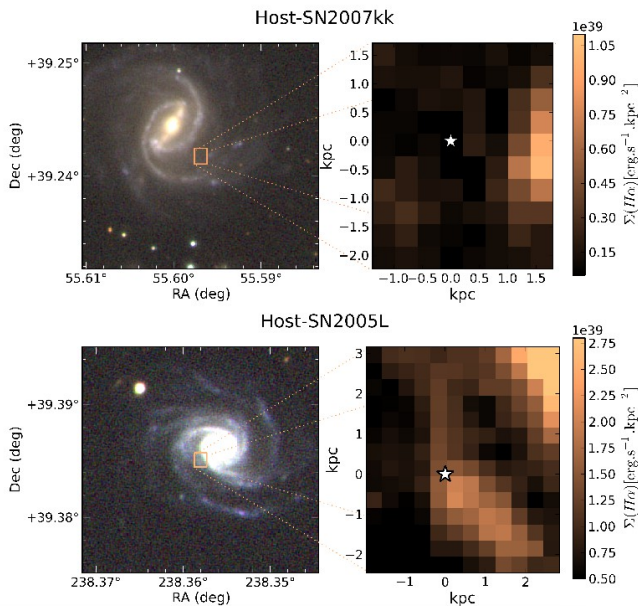
Global : Mass step



$$\mu = m_B^* - \mathcal{M}(\mathcal{G}) + \alpha X_1 - \beta C$$

Supernova properties impact magnitude

C : Color
 X_1 : Stretch
Host galaxy



Local : SFR step

Active \rightarrow less dispersion

(Rigault et al. 2013,2015)

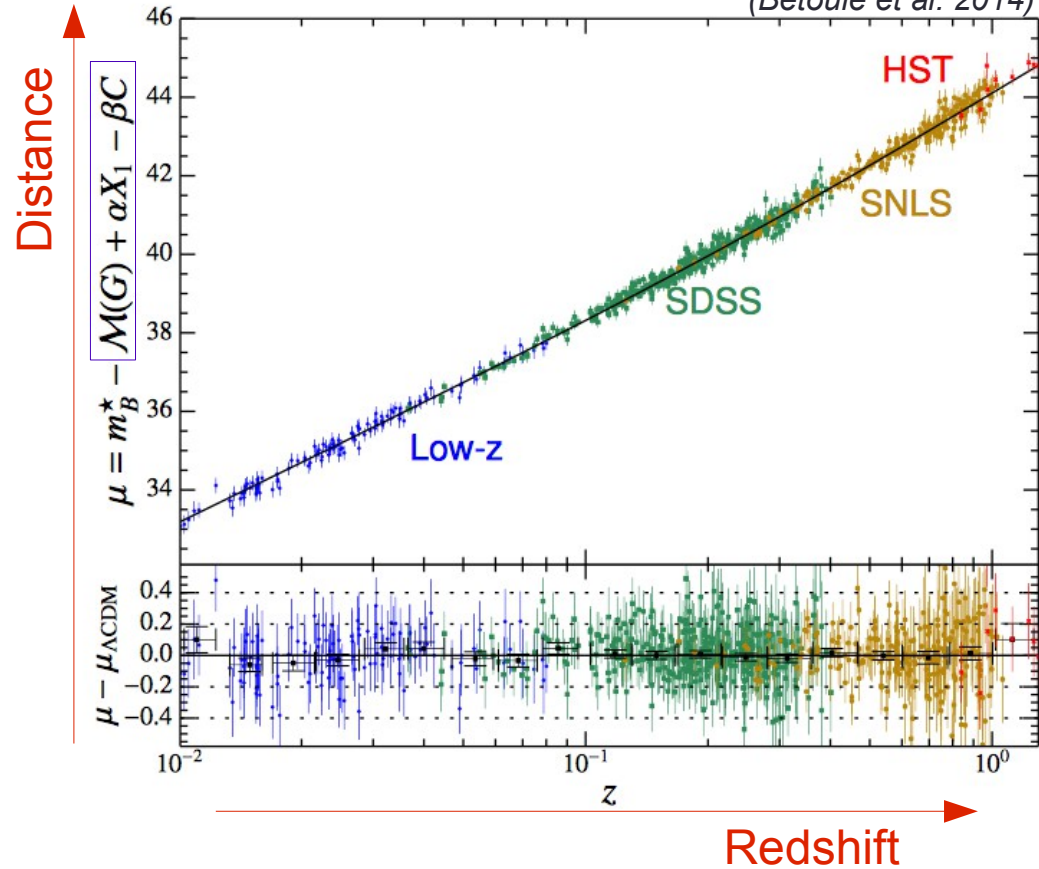
Is host galaxy a proxy for some hidden parameters ?

SN as standardizable candles

Fit to Hubble diagram

- cosmological parameters
- **Supernova parameters**

(Bétoule et al. 2014)



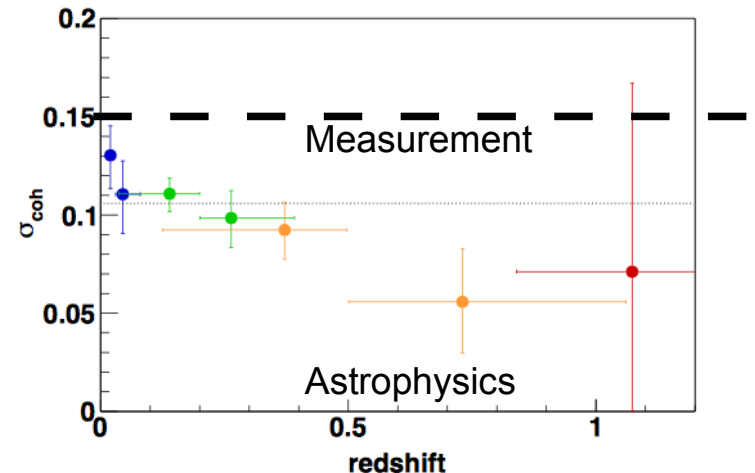
$$\mu = m_B^* - \mathcal{M}(G) + \alpha X_1 - \beta C$$

Supernova properties impact on magnitude

C : Color
X_1 : Stretch
Host galaxy

→ SALT2

Additional dispersion :
What we don't control !

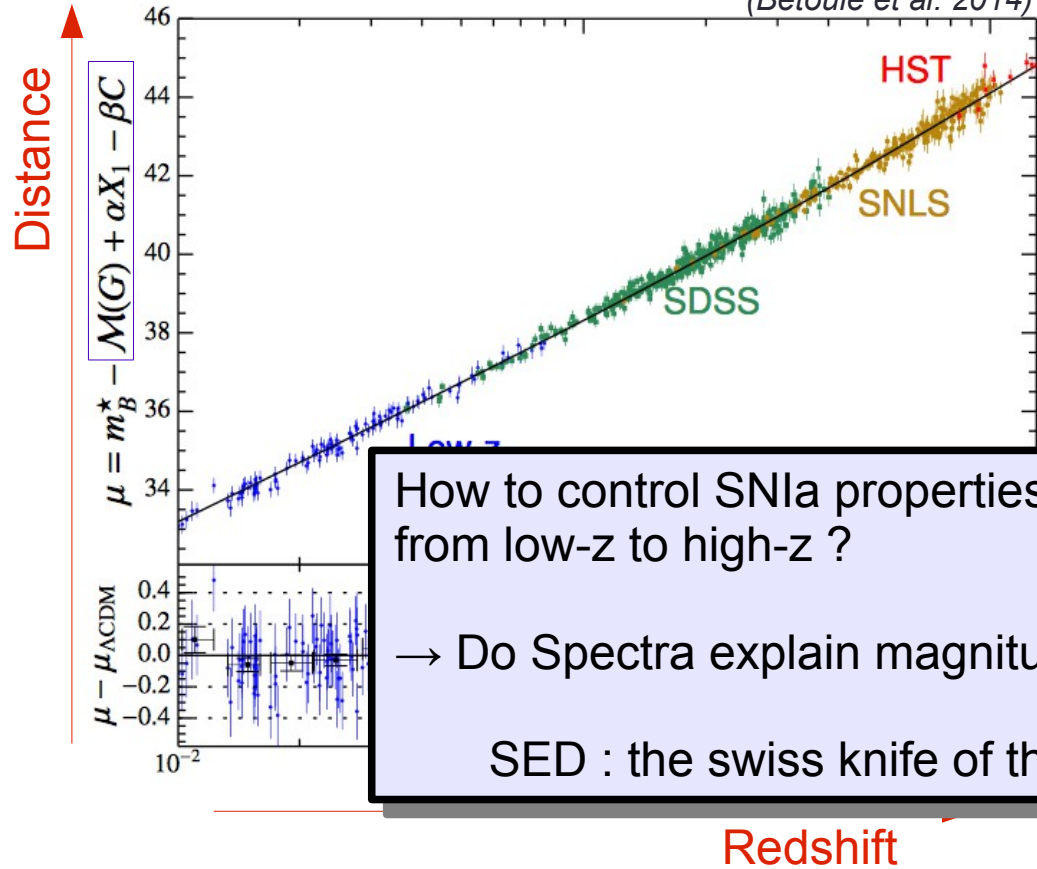


SN as standardizable candles

Fit to Hubble diagram

- cosmological parameters
- **Supernova parameters**

(Bétoule et al. 2014)



$$\mu = m_B^* - M(G) + \alpha X_1 - \beta C$$

Supernova properties impact on magnitude

C : Color
X_1 : Stretch
Host galaxy

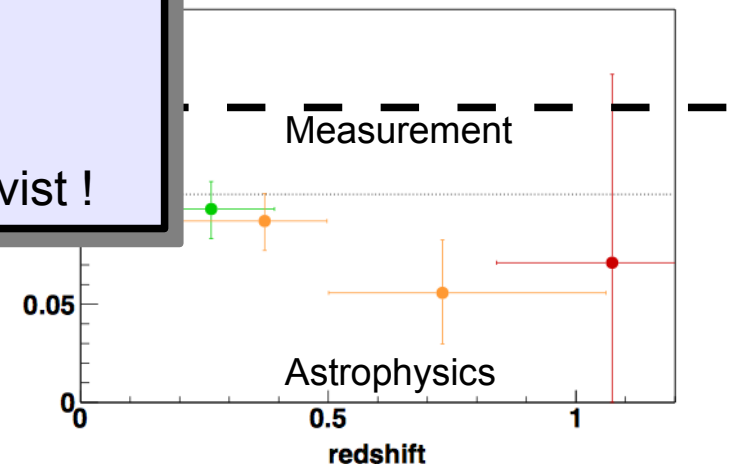
→ SALT2

How to control SNIa properties behave similarly from low-z to high-z ?

→ Do Spectra explain magnitude ?

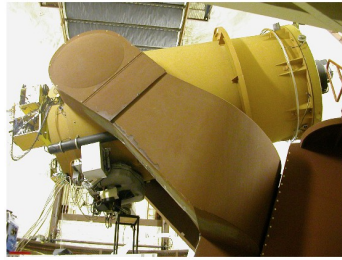
SED : the swiss knife of the supernovist !

ersion :
on't control !



Building an SED model

beyond **stretch/color**

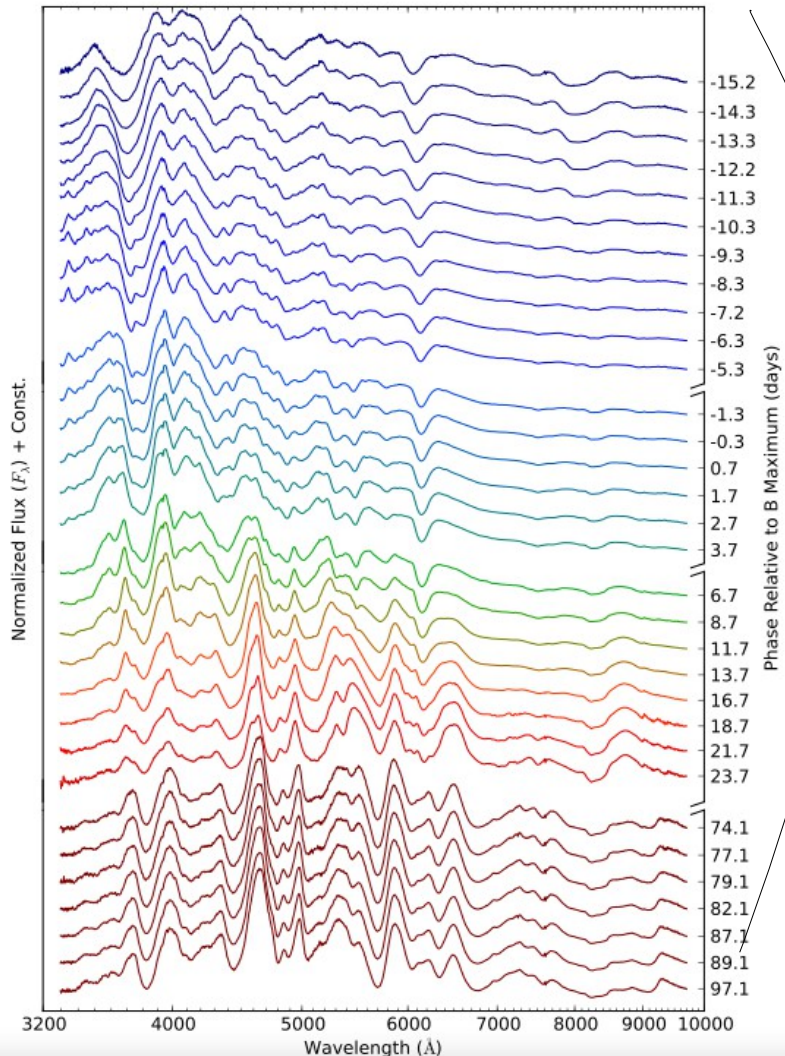


Input data : **spectrophotometric time series**

From SNFactory collaboration
UH 88 + SNIFS instrument (2004-2013)

232 « Good » Supernovae
3462 Spectra → ~15 spectra/SN

Photometric calibration 0.03-4 mag



SN2011fe (Pereira et al. 2013)

→ **SED**

$$M(\lambda, t)^{SN} = f(M_i(\lambda, t), q_i^{SN})$$

→ **SN parameters**

→ Model response

→ Observed spectral serie
(restframe)

How to choose parameters ?

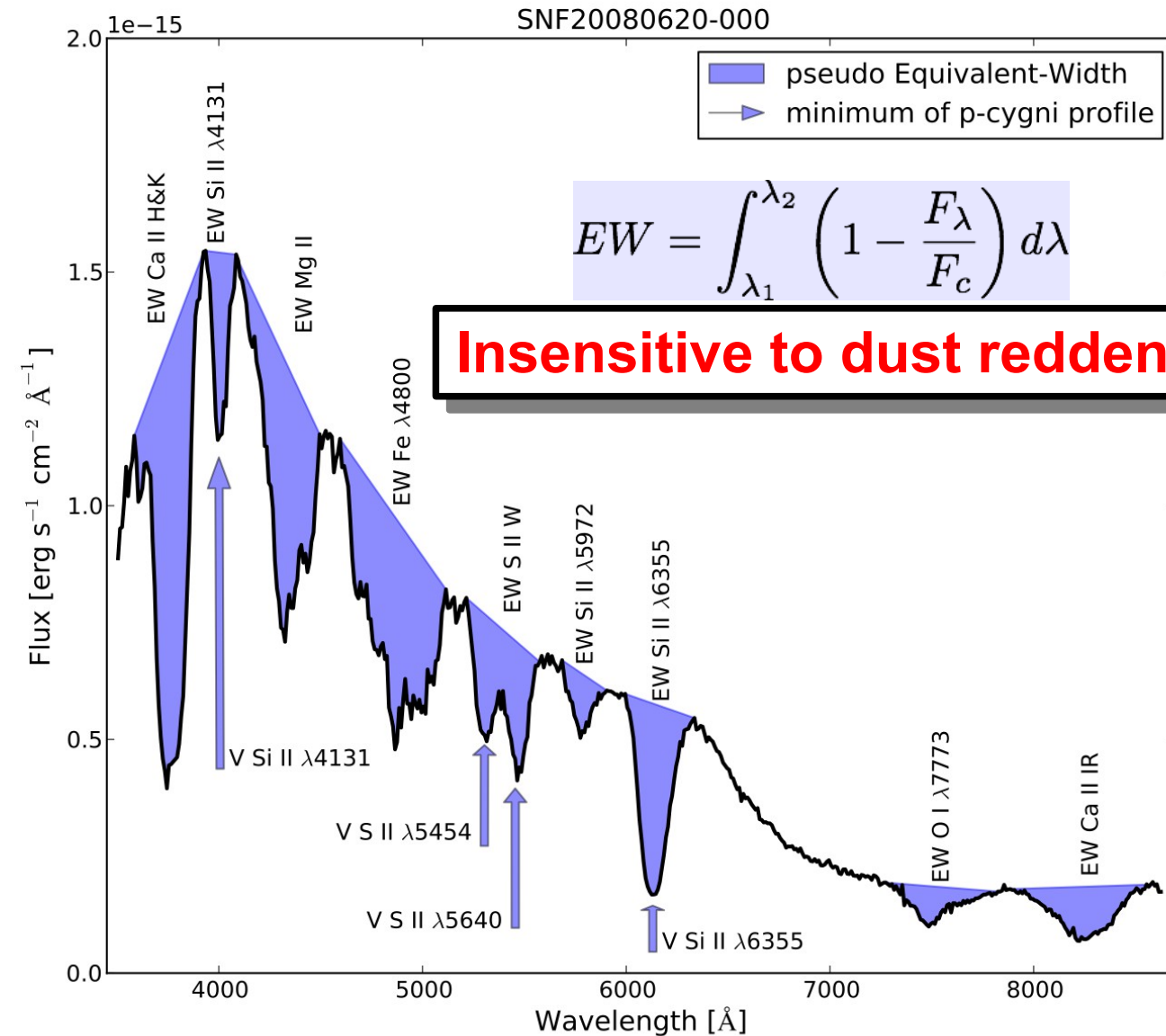
→ **physically inspired** inputs

Average of ~35 100 measurements/SN

→ **dimensional reduction** !

Dimensional reduction

- 1) Define set of Spectral indicators
- 2) Further reduction to meaningful set



$$EW = \int_{\lambda_1}^{\lambda_2} \left(1 - \frac{F_\lambda}{F_c} \right) d\lambda$$

Inensitive to dust reddening

Spectral indicators at Maximum

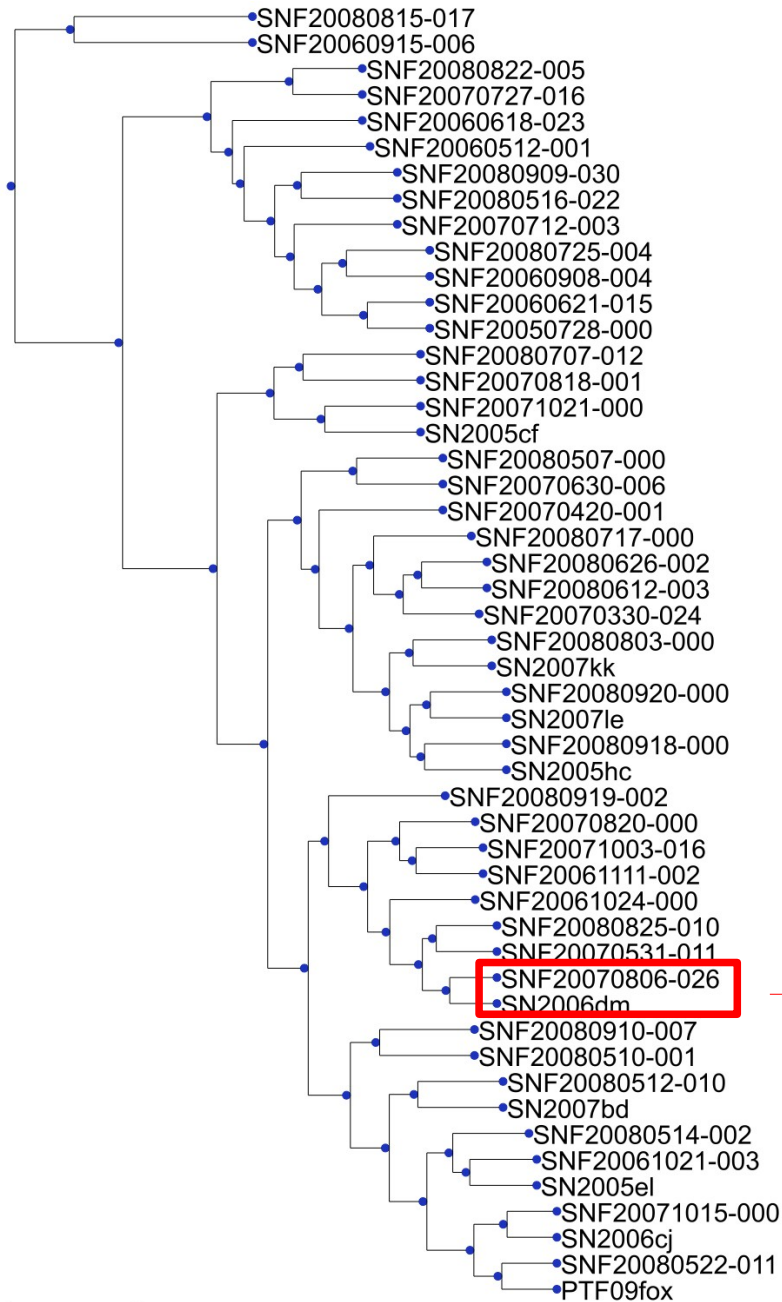
- 9 Pseudo Equivalent Widths
 Linked to composition
 & temperature
- 4 Velocities
 Linked to kinetic nergy

→ 13 dimensional space

Extracted by :

Optimal smoothing
 Automatic edge detection
 MC error estimation

Spectral Indicator space as a similarity space



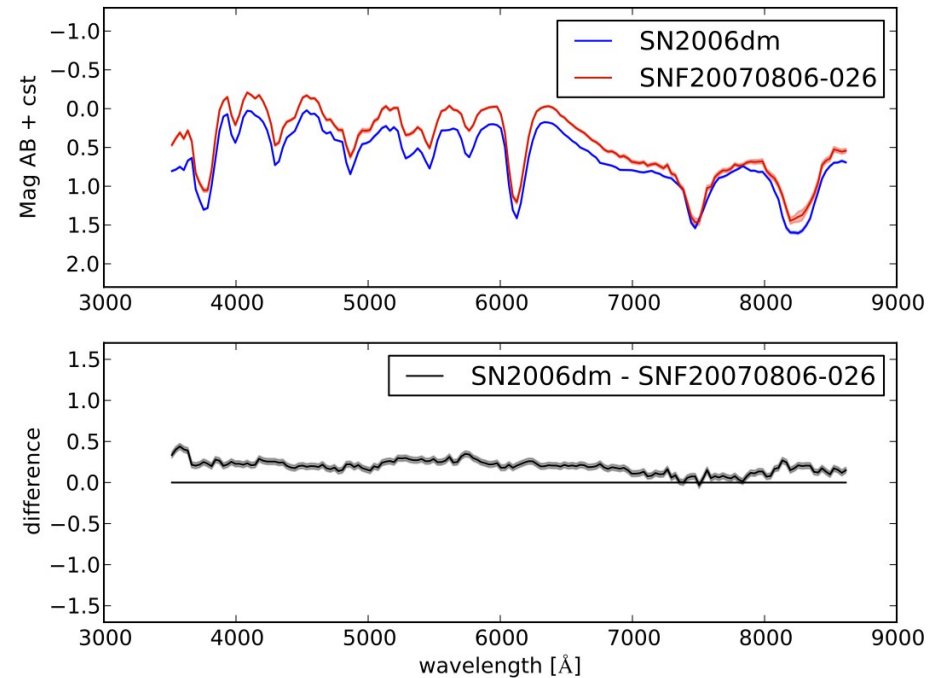
Phylogenetic tree of Supernovae :

Distance in the SI space (instead of DNA)

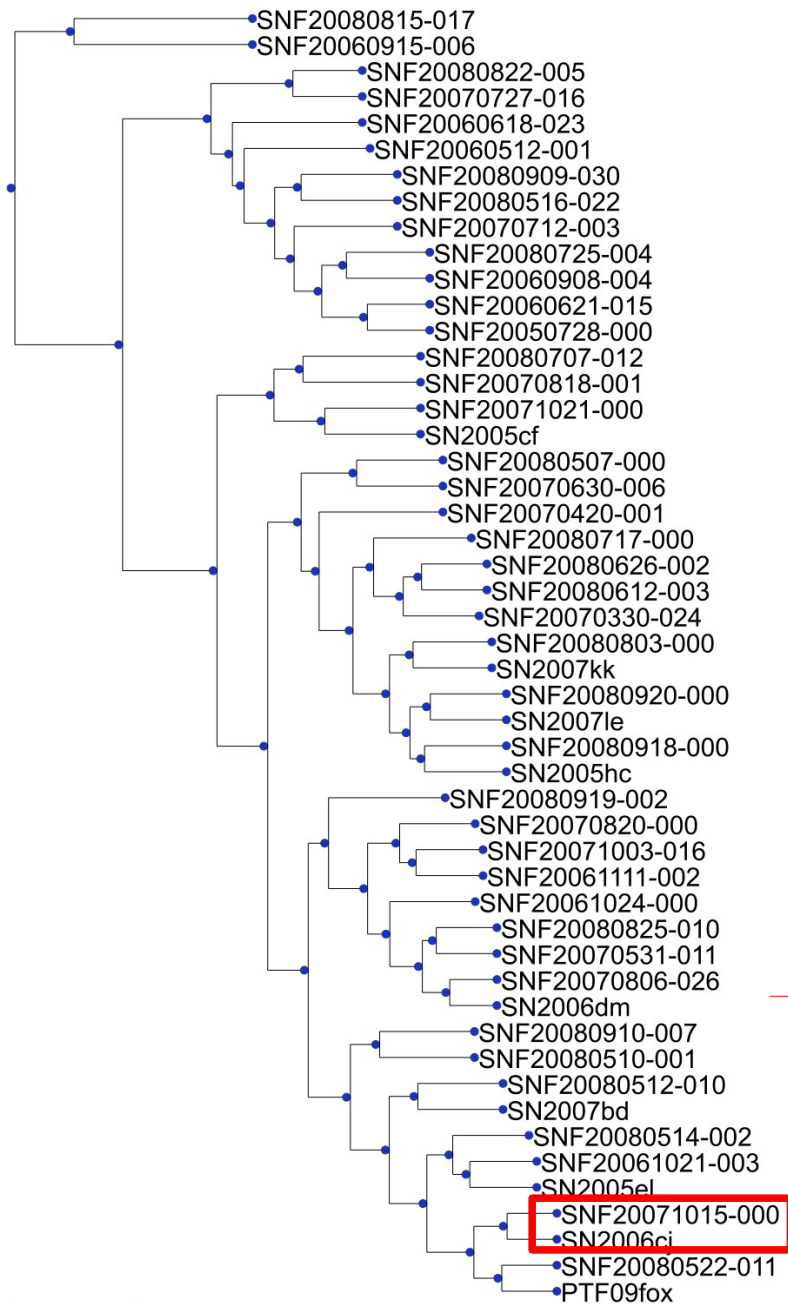
Twins supernovae are grouped together

→ Are SI Twins spectrally similar ?

Yes !



Spectral Indicator space as a similarity space



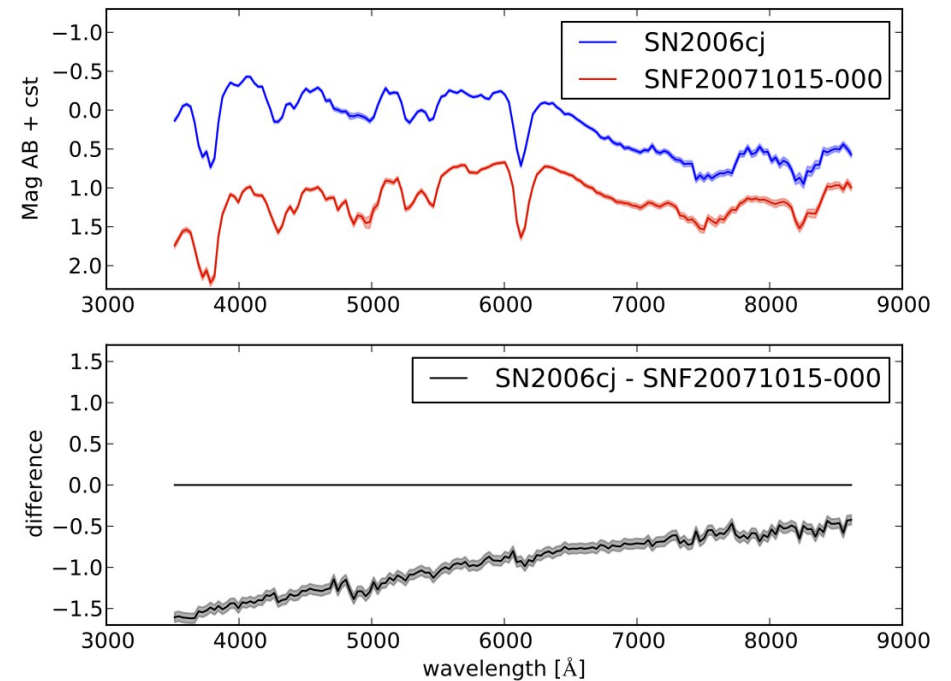
Phylogenetic tree of Supernovae :

Distance in the SI space (instead of DNA)

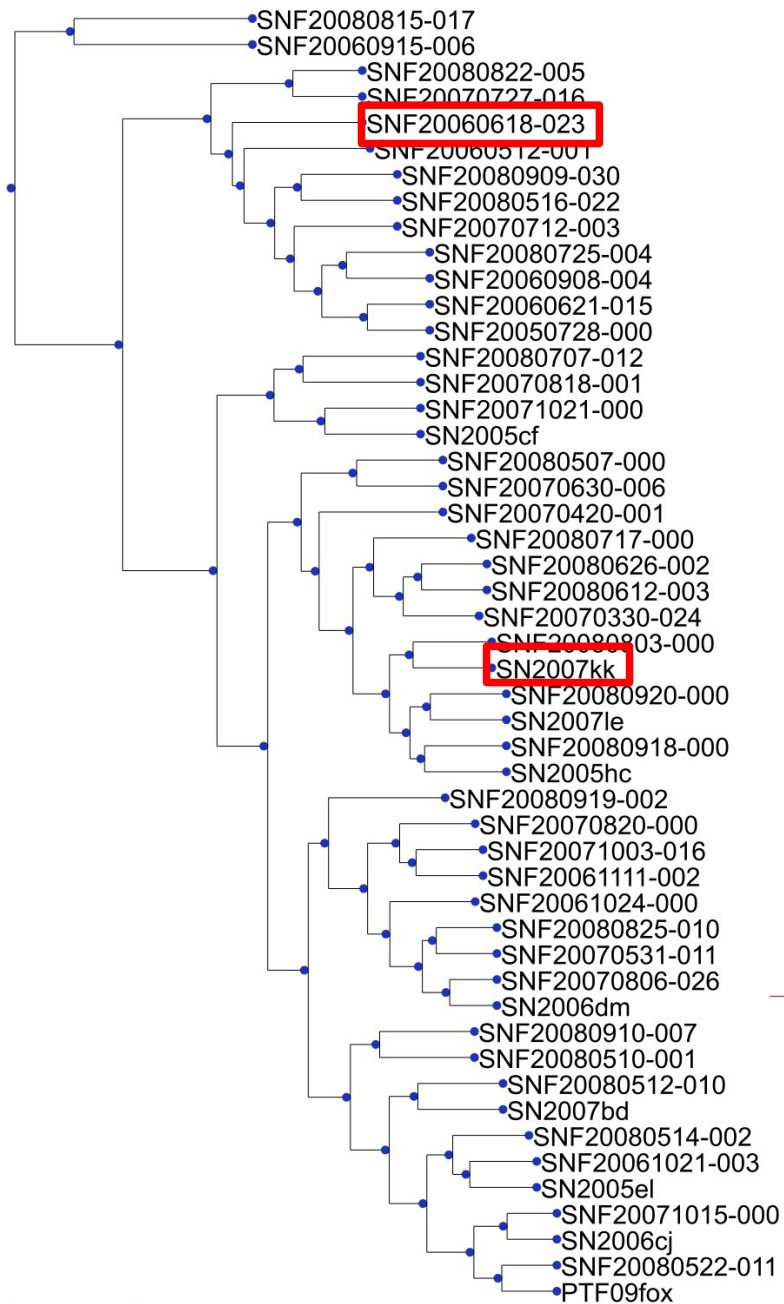
Twins supernovae are grouped together

→ Are SI Twins spectrally similar ?

Still Yes !



Spectral Indicator space as a similarity space



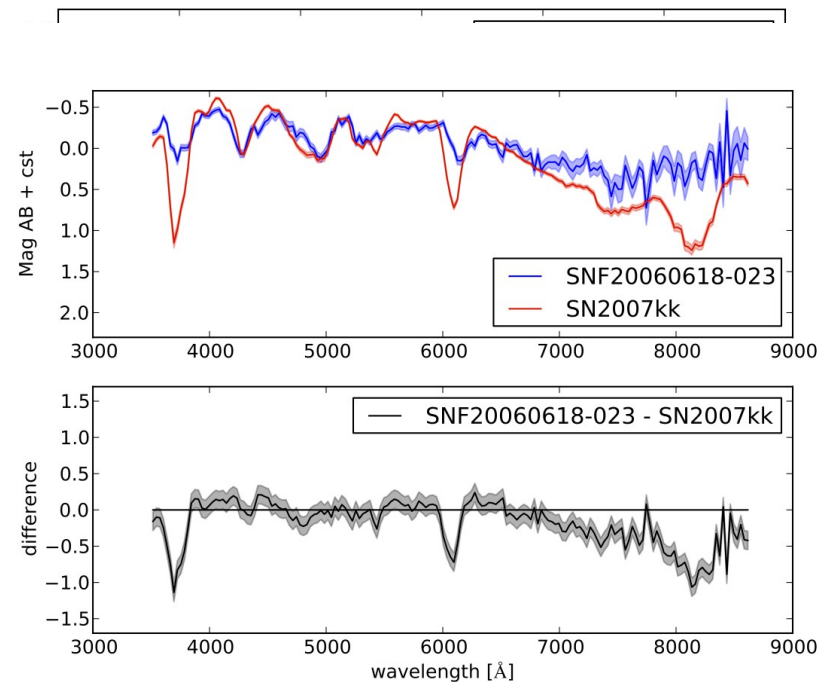
Phylogenetic tree of Supernovae :

Distance in the SI space (instead of DNA)

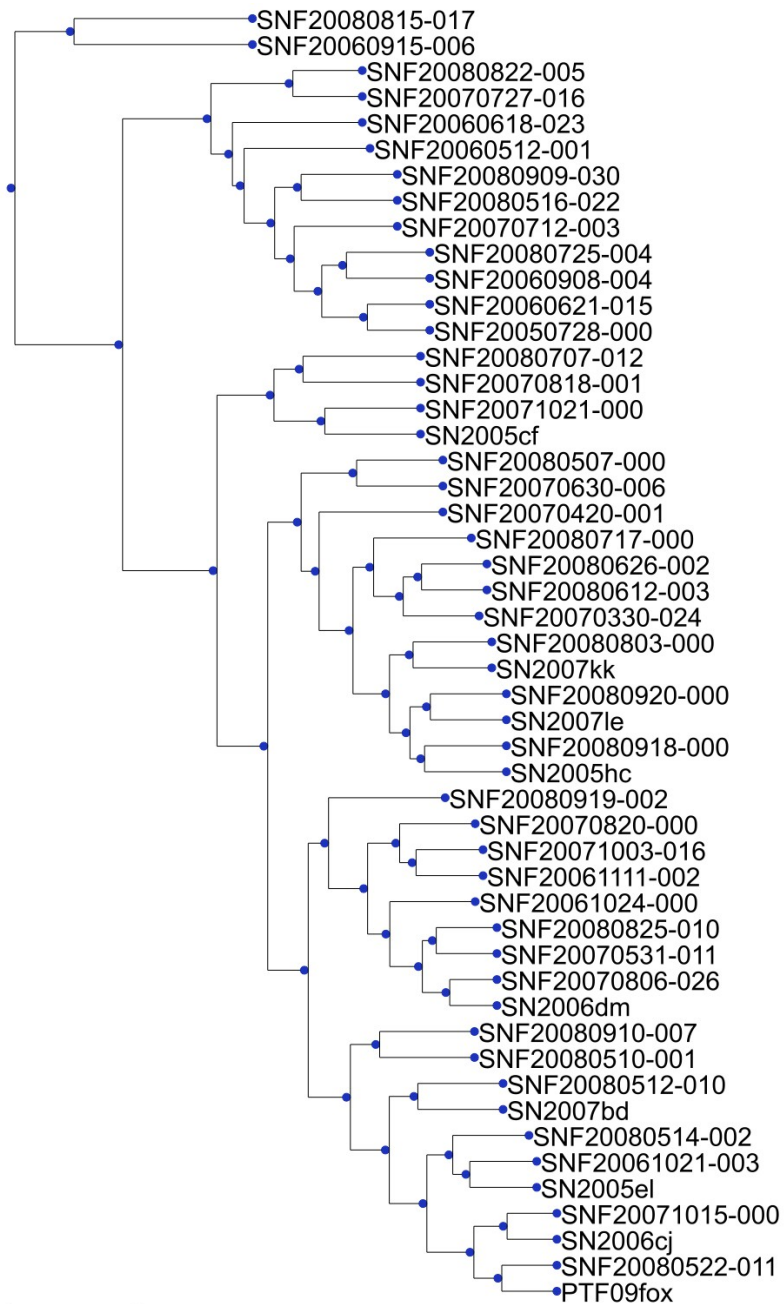
Twins supernovae are grouped together

→ Are SI-different SN spectrally different ?

Yes (again) !



Spectral Indicator space as a similarity space



Phylogenetic tree of Supernovae :

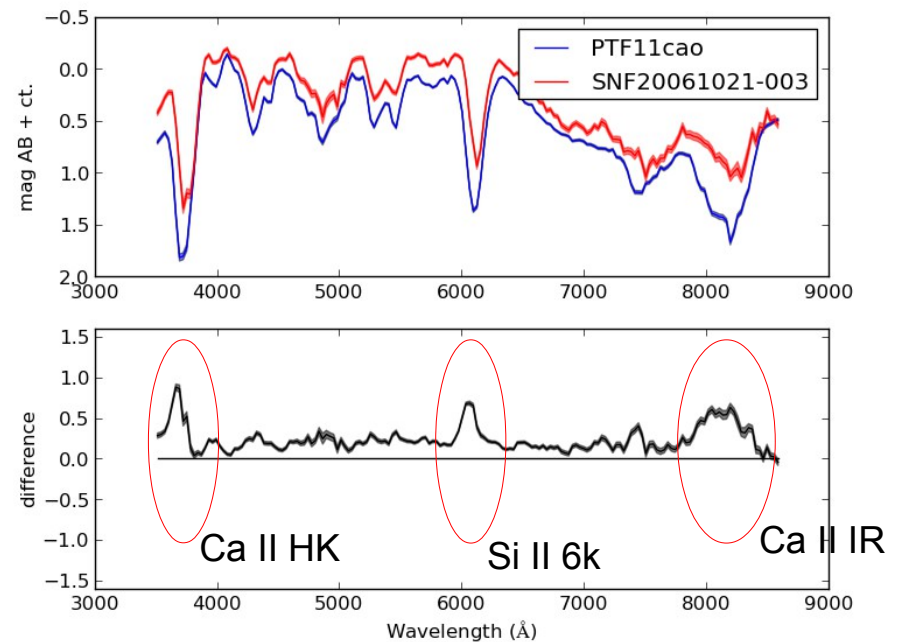
Distance in the SI space (instead of DNA)

Twins supernovae are grouped together

→ And SALT-2 Twins ?

(Same color, same stretch ± 0.01)

Not quite ...



Further Dimensionality reduction : From 13 to 3 dimensions

Expectation-Minimization Factor Analysis :

| Eigenvectors | Eigenvalues | Variability |
|--------------|-------------|-------------|
| 1 | 4.41 | 33.92% |
| 2 | 3.46 | 26.61% |
| 3 | 1.37 | 10.53% |
| 4 | 0.60 | 4.62% |
| 5 | 0.59 | 4.54% |
| 6 | 0.34 | 2.62% |
| 7 | 0.18 | 1.38% |
| 8 | 0.14 | 1.07% |
| 9 | 0.09 | 0.69% |
| 10 | 0.02 | 0.15% |
| 11 | 0 | 0% |
| 12 | 0 | 0% |
| 13 | 0 | 0% |
| Noise | / | 13.87% |

- PCA-like
- Correct treatment of measurement uncertainties
(*Likelihood optimization*)

$$X^{SN} = \mathcal{N}(X_0, \Lambda\Lambda^T + \psi^{SN})$$

↳ Dispersion in SI space
+ Orthogonalization

$$X^{SN} = \Lambda Q^{SN} + \epsilon^{SN}$$

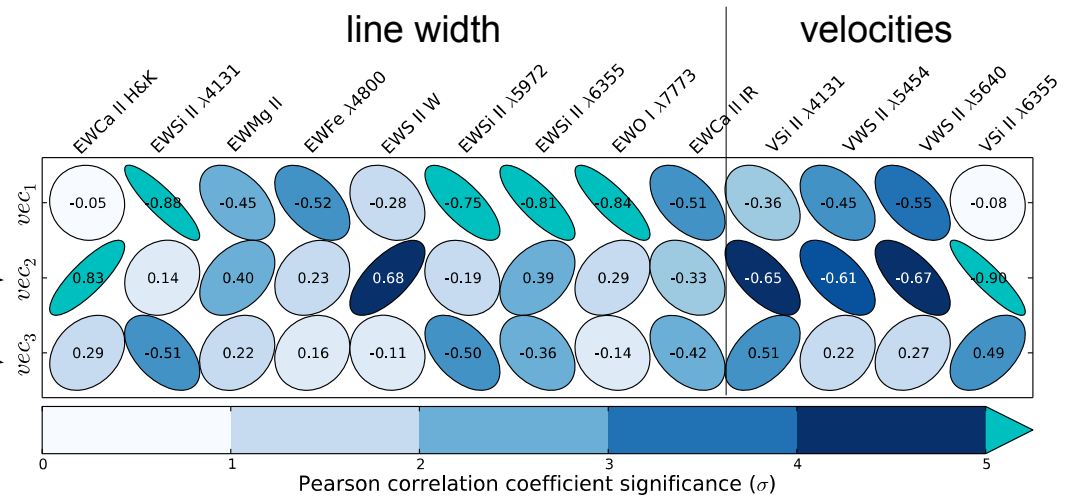
↳ Unknown Factors
= SN Parameters

3 Eigenvectors + noise explains
85% of data variance

- Orthogonal solution w/o loss of generality

Further Dimensionality reduction : From 13 to 3 dimensions

| Eigenvectors | Eigenvalues | Variability |
|--------------|-------------|-------------|
| 1 | 4.41 | 33.92% |
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| 10 | 0.02 | 0.15% |
| 11 | 0 | 0% |
| 12 | 0 | 0% |
| 13 | 0 | 0% |
| Noise | / | 13.87% |



Vector 1 : Line depth correlation
→ expected for stretch

Vector 2 : Ca II HK Width / Si II 6k velocity
→ not seen by Salt2 (?)

Vector 3 : Possibly Si II lines internal variation
→ interpretation unclear

Vectors 4 & more : Unstable vs. sample

3 Eigenvectors + noise explains
85% of data variance

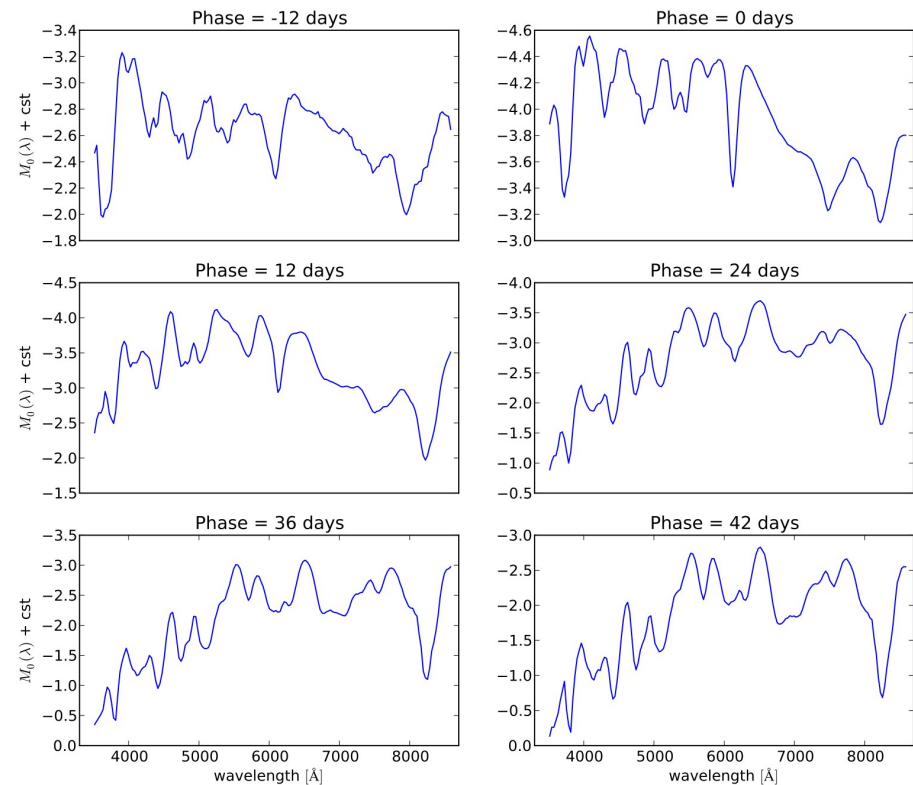
SUGAR Spectral Energy Density model :

$$M(t; \lambda) = M_0(t; \lambda) + \sum_{i=1}^{i=3} \alpha_i(t; \lambda) q_i + A_V f(R_V; \lambda) + \Delta M_{grey}$$

Supernova parameters :

Model response :

► Average spectrum



SUGAR Spectral Energy Density model :

$$M(t; \lambda) = M_0(t; \lambda) + \sum_{i=1}^{i=3} \alpha_i(t; \lambda) q_i + A_V f(R_V; \lambda) + \Delta M_{grey}$$

Supernova parameters :

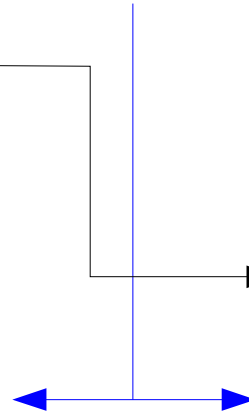
Model response :

Average spectrum

3 intrinsic parameters

→ non-linear transform of spectra

3 Spectral intrinsic response
(time-dependant)



SUGAR Spectral Energy Density model :

$$M(t; \lambda) = M_0(t; \lambda) + \sum_{i=1}^{i=3} \alpha_i(t; \lambda) q_i + A_V f(R_V; \lambda) + \Delta M_{grey}$$

Supernova parameters :

Model response :

Average spectrum

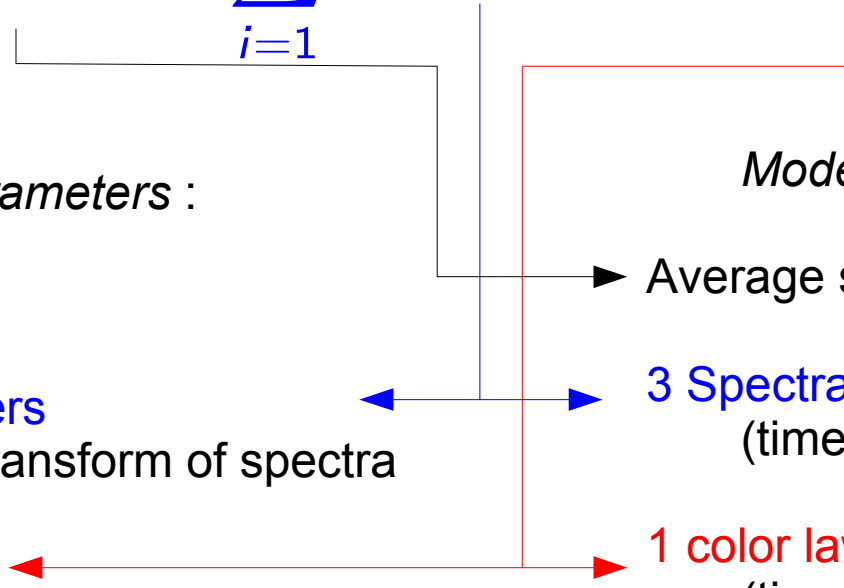
3 intrinsic parameters

→ non-linear transform of spectra

3 Spectral intrinsic response
(time-dependant)

1 extinction

1 color law
(time-independant)



SUGAR Spectral Energy Density model :

$$M(t; \lambda) = M_0(t; \lambda) + \sum_{i=1}^{i=3} \alpha_i(t; \lambda) q_i + A_V f(R_V; \lambda) + \Delta M_{grey}$$

Supernova parameters :

Model response :

Average spectrum

3 intrinsic parameters

→ non-linear transform of spectra

3 Spectral intrinsic response
(time-dependant)

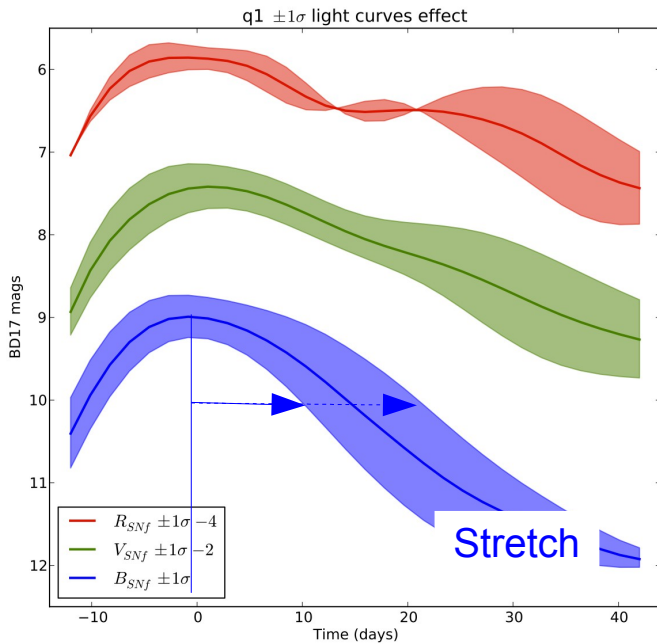
1 extinction

1 color law
(time-independant)

1 global luminosity offset (distance)

Global fit on a training data set
 q_i fitted both on SI vectors and on spectral data
 → possible to fit SN w/o SI data.
 Performances on pre-validation set

SUGAR Spectral Energy Density model :



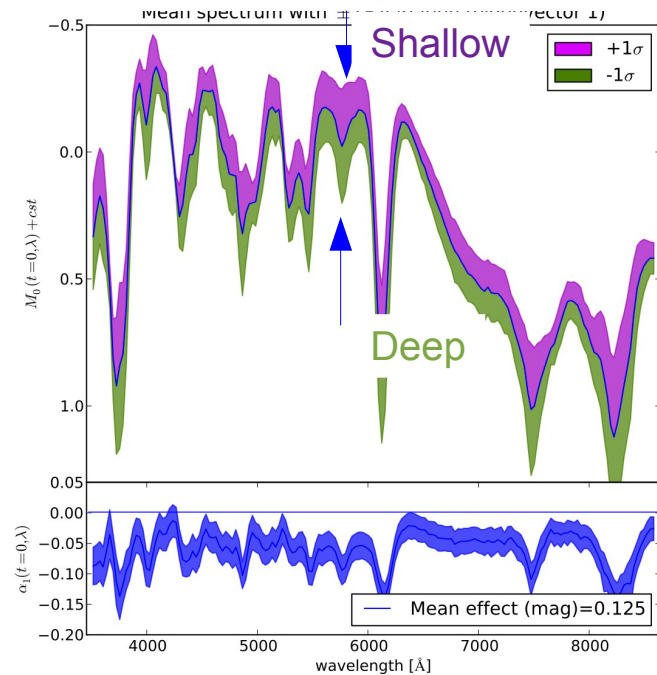
$$M(t; \lambda) + \sum_{i=1}^{i=3} \alpha_i(t; \lambda) q_i + A_V f(R_V; \lambda) + \Delta M_{grey}$$

Model response :

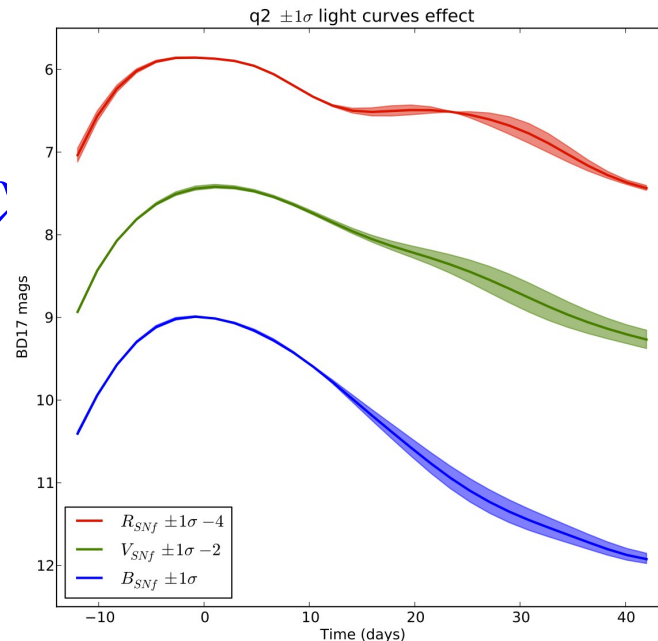
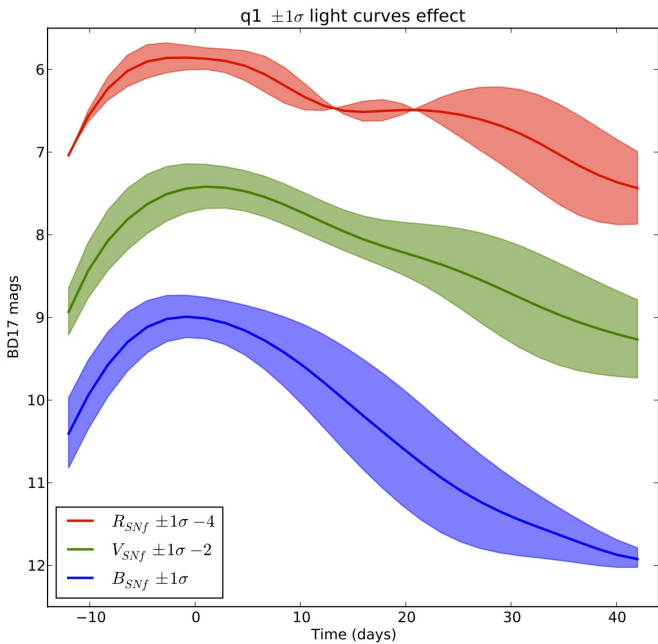
Average spectrum

Spectral vector 1 : (0.13 mag)

→ **Brighter / Shallower**
 = stretch



SUGAR Spectral Energy Density model :



$$f(R_V; \lambda) + \Delta M_{grey}$$

Model response :

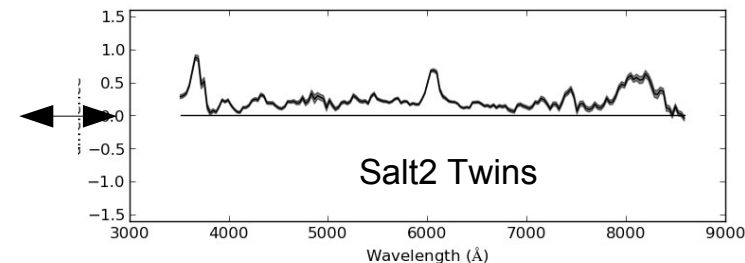
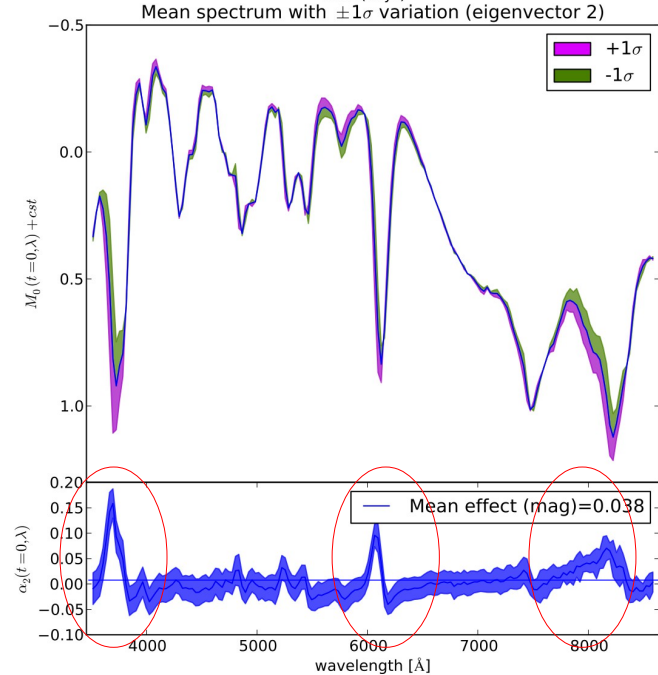
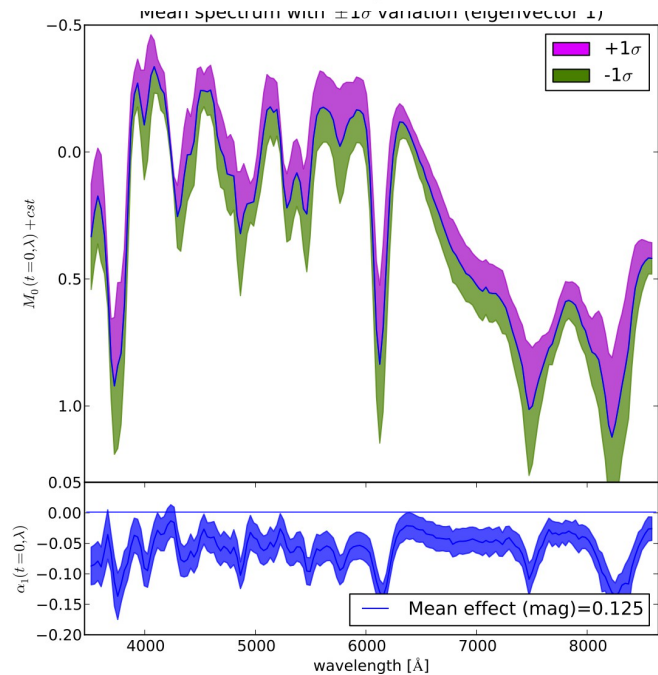
Average spectrum

Spectral vector 1 : (0.13 mag)

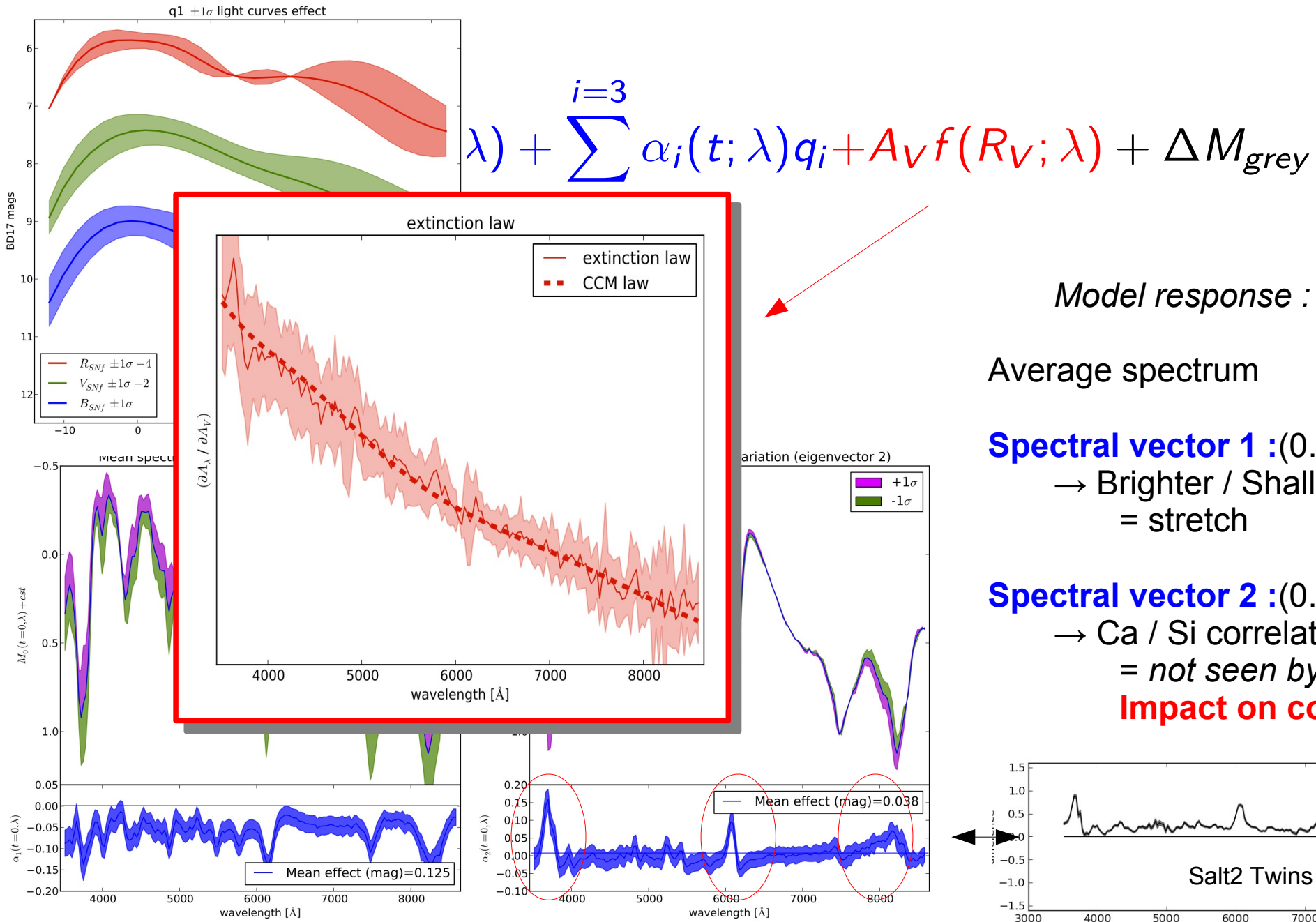
→ Brighter / Shallower
= stretch

Spectral vector 2 : (0.04 mag)

→ Ca / Si correlation
= marginal on LC



SUGAR Spectral Energy Density model :



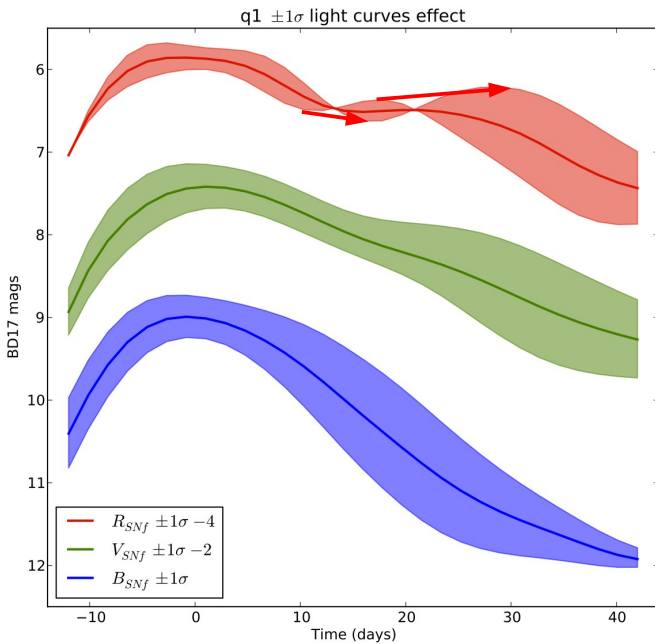
Model response :

Average spectrum

Spectral vector 1 :(0.13 mag)
 → Brighter / Shallower
 = stretch

Spectral vector 2 :(0.04 mag)
 → Ca / Si correlation
 = *not seen by SALT2*
Impact on color law

SUGAR Spectral Energy Density model :

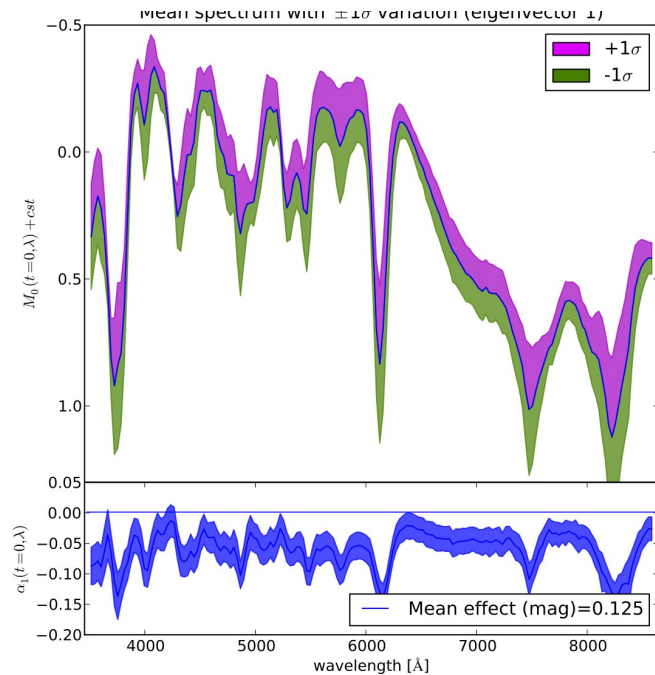
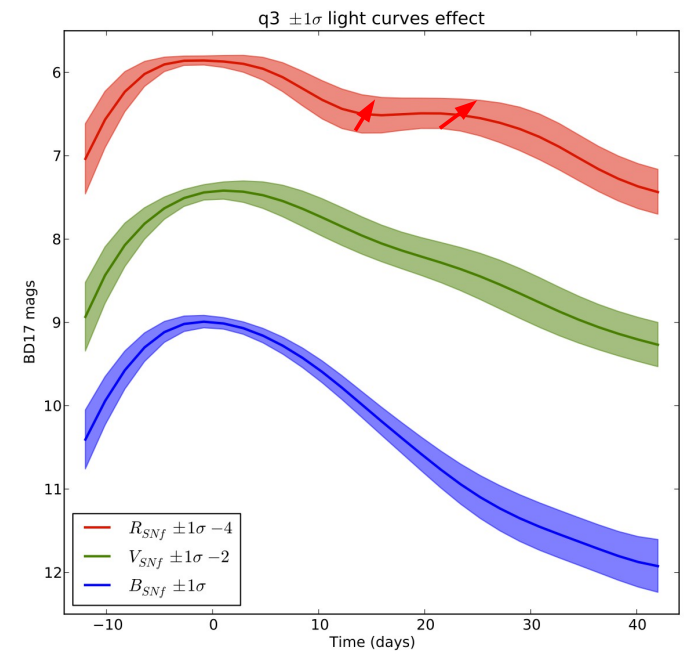


Model response :

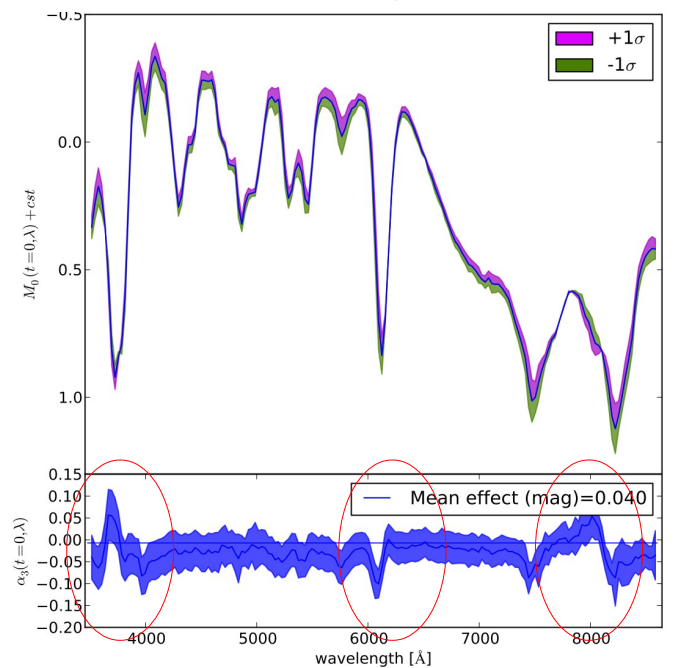
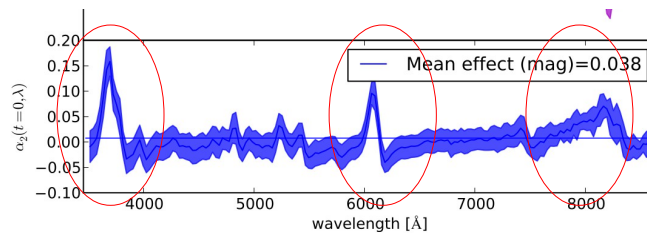
Average spectrum

Spectral vector 1 : (0.13 mag)
 → Brighter / Shallower
 = stretch

Spectral vector 2 : (0.04 mag)
 → Ca / Si correlation
 Impact on color law

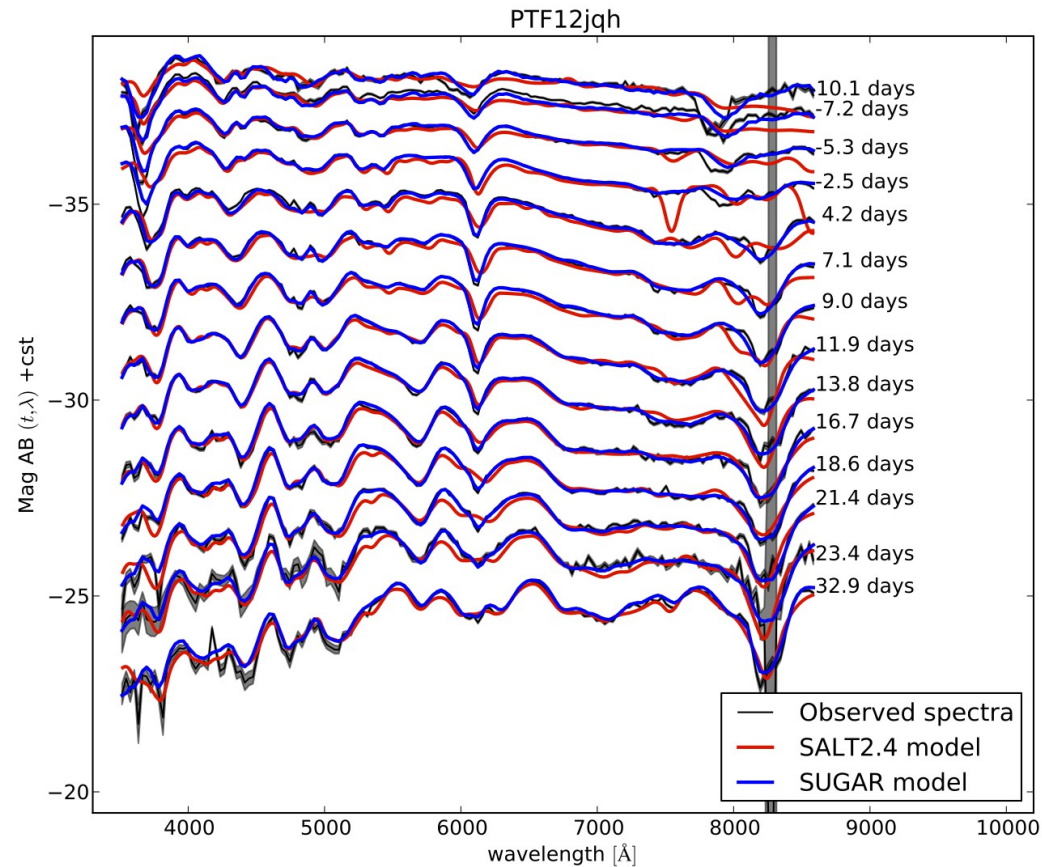


Spectral vector 3 : (0.04 mag)
 → Still Ca / Si influence
 → **Global impact on LC**
Can be seen in R band !

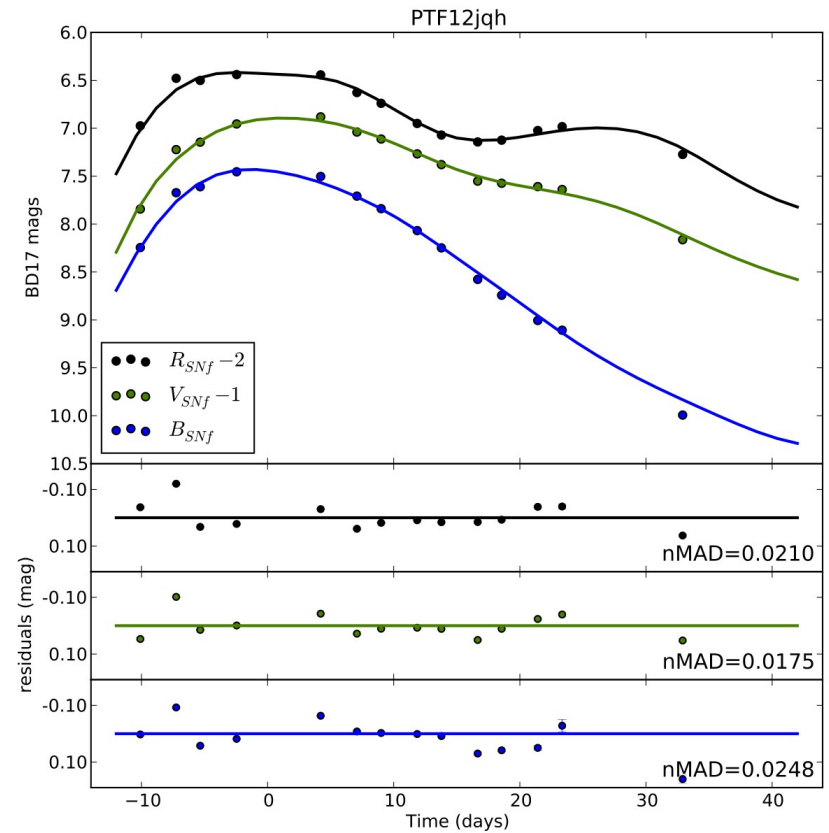


Using SUGAR as a fitter :

Spectral time serie view



Light-curve view

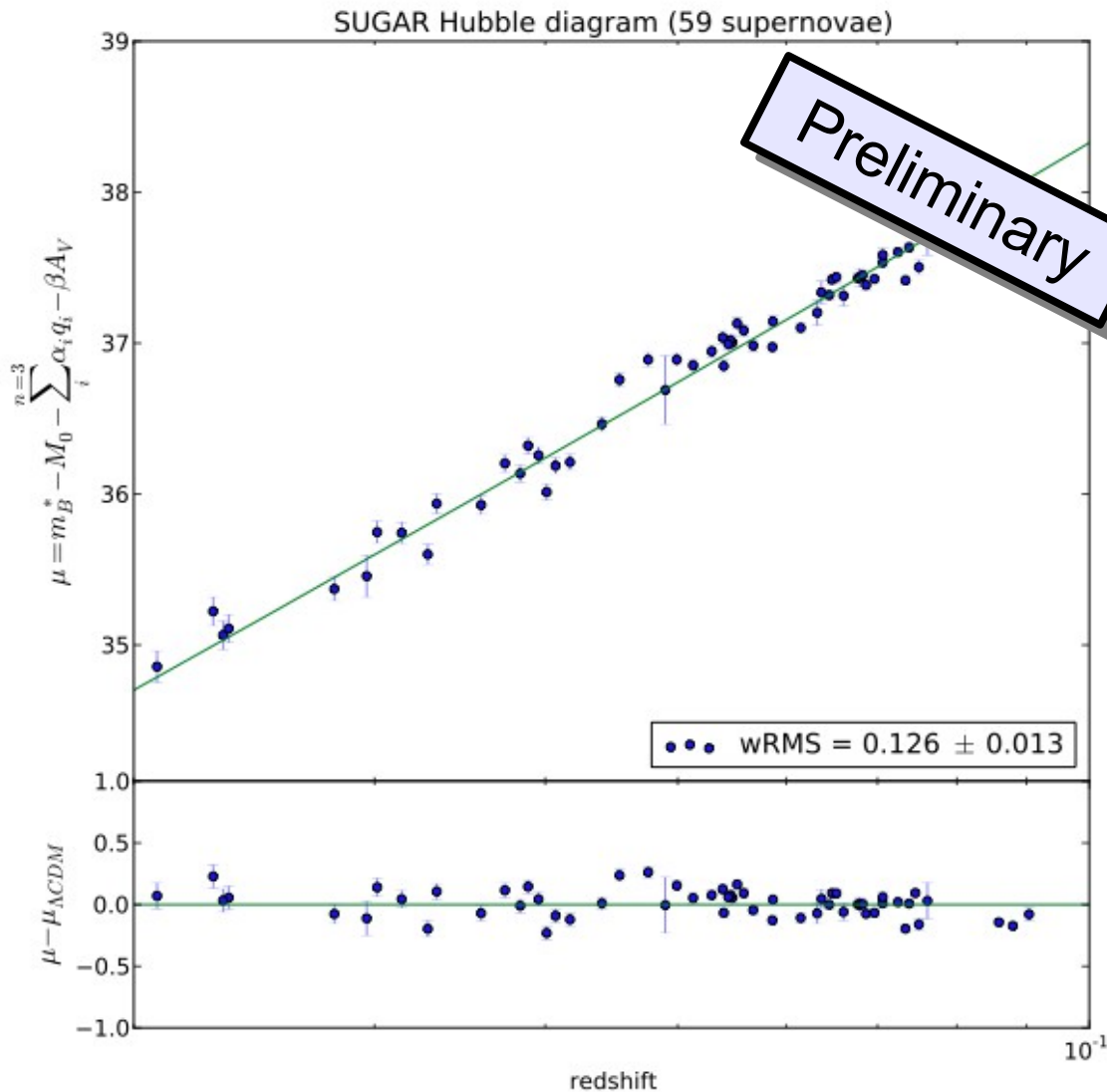


Pre-validation sample

| nMAD | Bsnf | Vsnf | Rsnf |
|--------|-------|-------|-------|
| SALT2 | 0.073 | 0.051 | 0.056 |
| SUGAR | 0.053 | 0.035 | 0.037 |
| Calib. | 0.030 | 0.030 | 0.029 |

**Spectral and Light-curve
Description improved**

Impact on standardization



Salt2-like standardization :

- 1) extract supernova parameters
- 2) fit model parameters

Preliminary results

Salt2 : $w\text{RMS} = 0.13 - 0.15$

SUGAR : $w\text{RMS} = 0.11 - 0.13$

This is SUGAR !

Supernova Useful Generator And Reconstructor

- Allows **simulation** of more realistic supernovae
 - 2 additional components beyond stretch and color
 - Confirmation color is dust-like
- Can be used as a supernova **fitter**
 - Spectral timeserie fit achieves good results
 - Some hope for **light-curves** (component 2 may prove difficult to fit w/o spectra)

Some perspectives and open questions :

- How to link SUGAR with **host galaxy** properties ?
- Sensitivity of **w** to the new parametrization ?
- Supernova standardization hits a limit near 0.08 – 0.10 mag
 - What does it mean ?