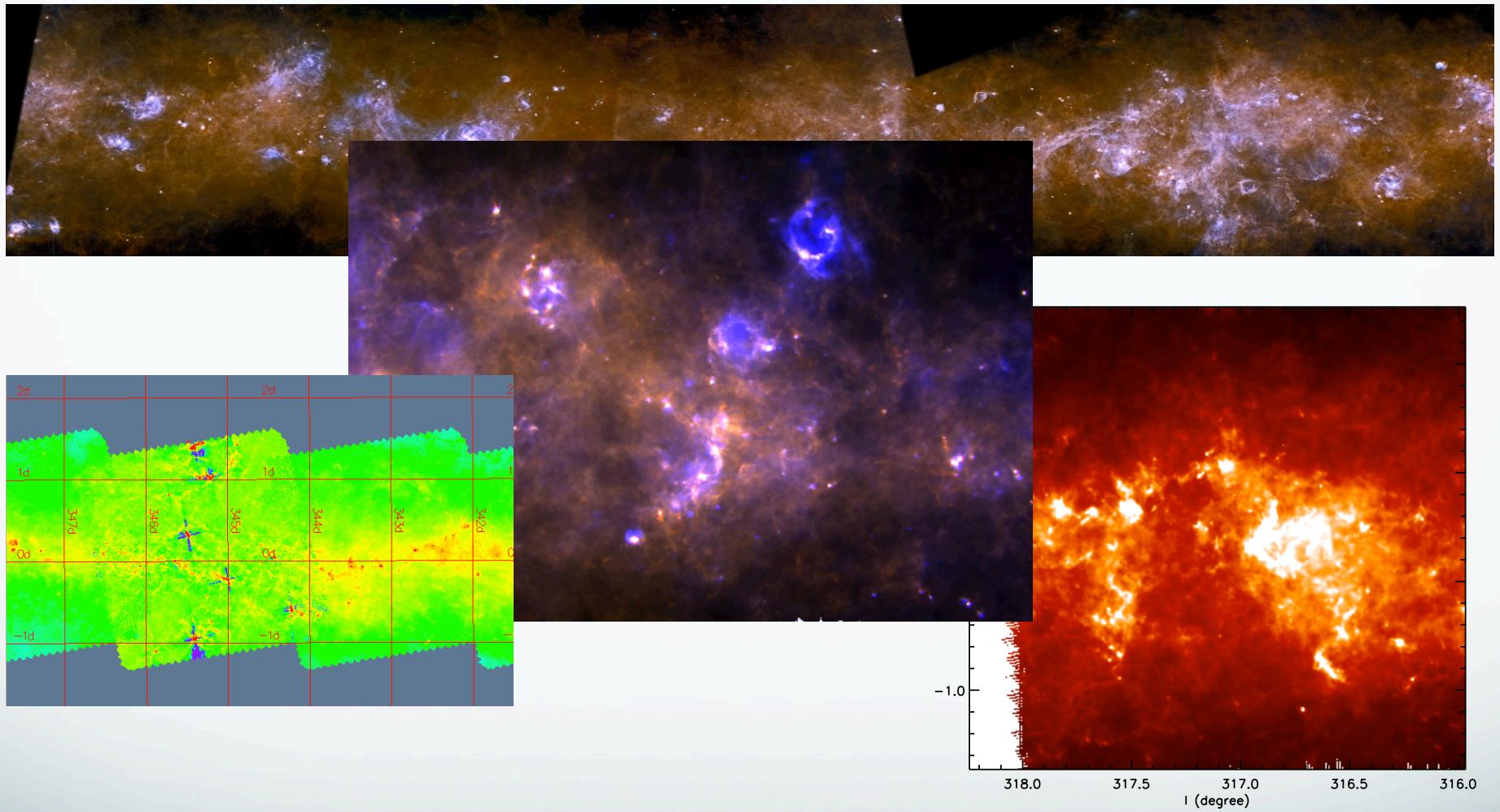


ROMAGAL: the Hi-GAL data reduction pipeline



A. Traficante and the Hi-GAL map-making team



Herschel map-making workshop 28-31/01/13

Outline

- Hi-GAL survey
- Hi-GAL pipeline: pre-processing steps
- Hi-GAL pipeline: ROMAGAL algorithm
- ROMAGAL PGLS
- Map calibration (Zero-level offset)
- Conclusions

Hi-GAL survey

Hi-GAL Herschel Infrared Galactic Plane Survey

(Molinari et al. 2010)

The largest Herschel open-time key project

Wavelength Coverage

70-500 μ m

Sky coverage

$2^\circ \times 360^\circ$
 $|b| \leq 1^\circ$ (following the Galactic warp)

Total Herschel time

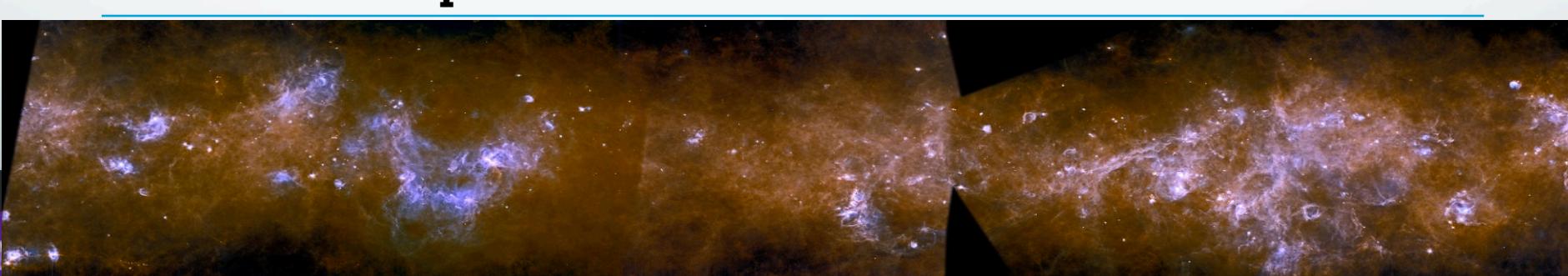
~ 900 hours

Scanning strategy

Parallel (PACS and SPIRE observe simultaneously)

Scan speed

60''/sec

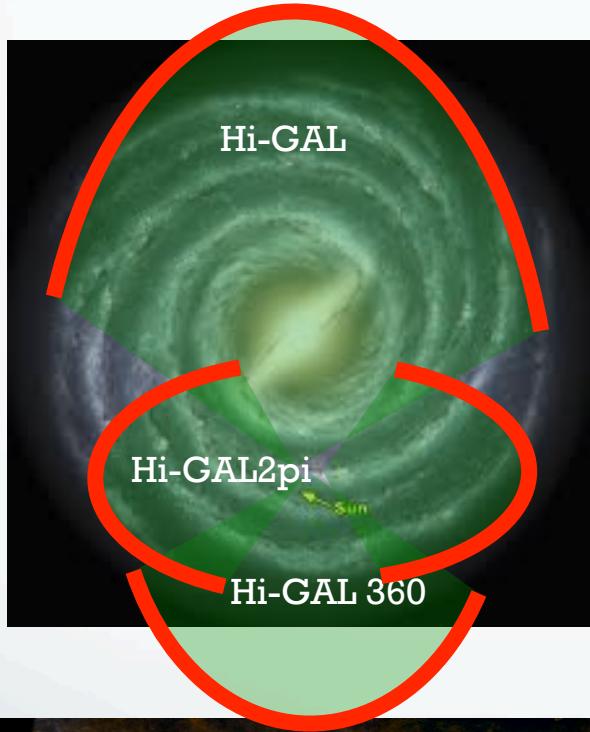


1024

Hi-GAL survey

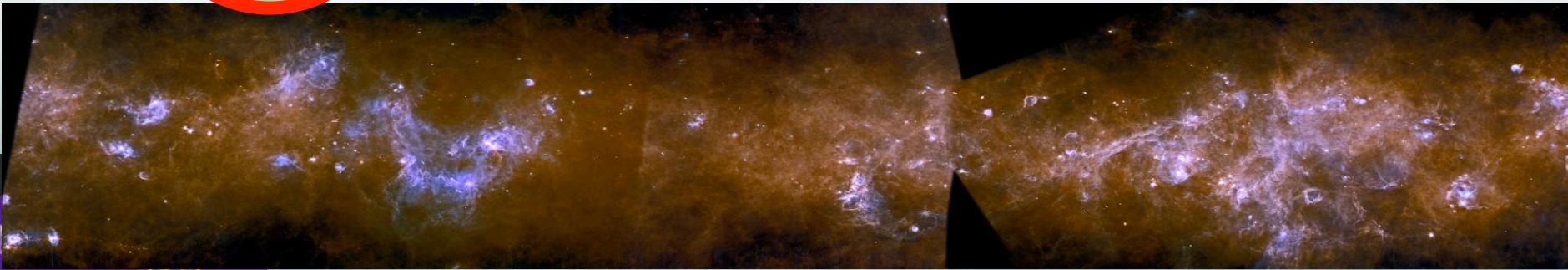
Hi-GAL Herschel Infrared Galactic Plane Survey

(Molinari et al. 2010)



Hi-GAL 1: $|b| < 1^\circ$ $-71^\circ < l < 66^\circ$

Hi-GAL 360 & HiGAL2pi: the whole Plane



10²⁴

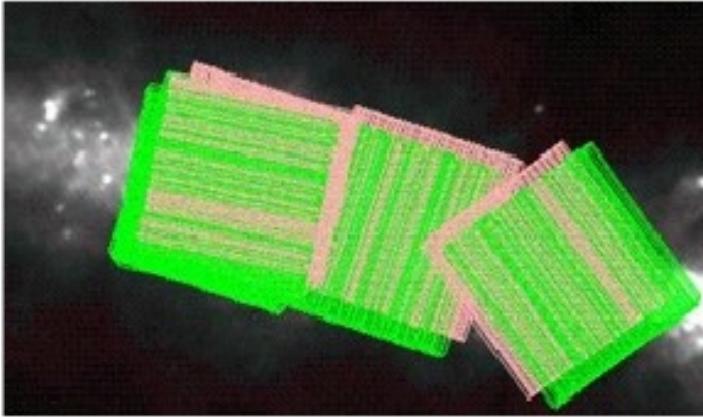
Alessio Traficante

Herschel map-making workshop 28-31/01/13

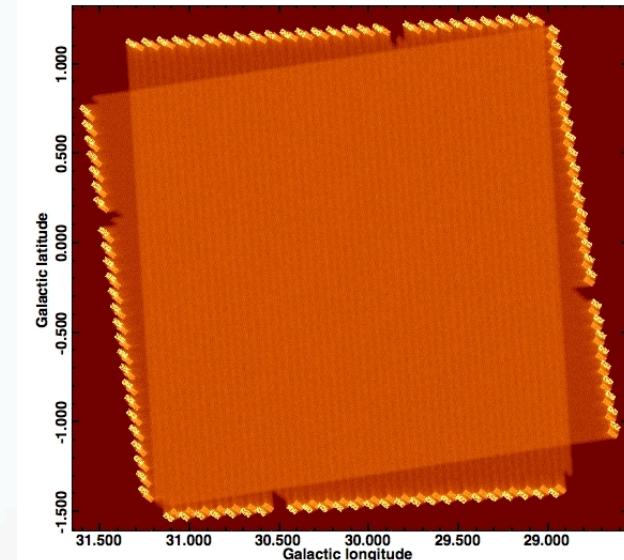
Hi-GAL survey

Hi-GAL Herschel Infrared Galactic Plane Survey

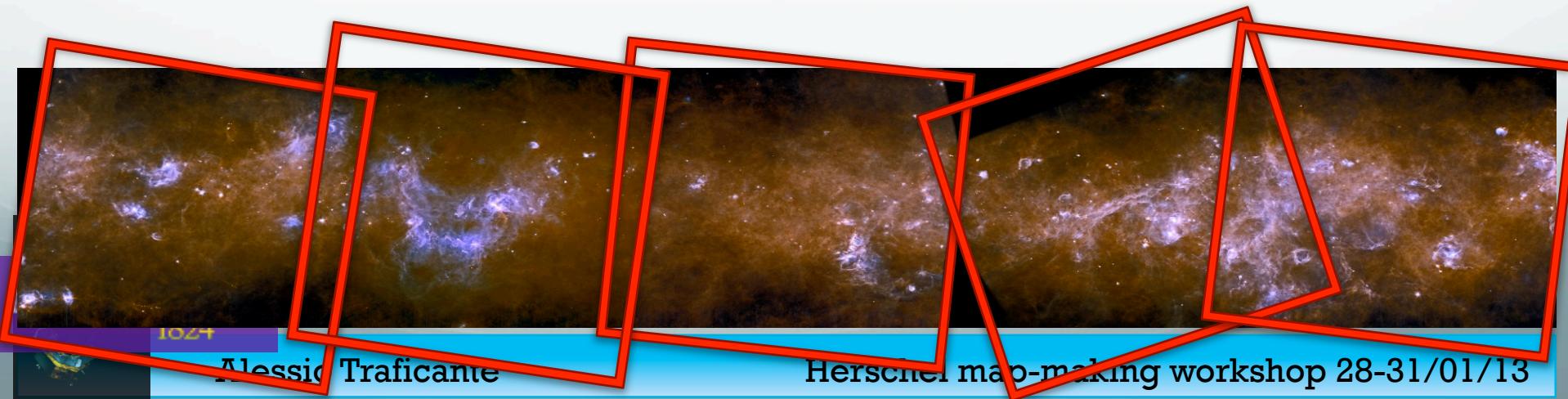
(Molinari et al. 2010)



Tiles cover the Galactic Plane
with different orientations



PACS 70 μ m $l=30$ coverage



Hi-GAL survey

Hi-GAL Herschel Infrared Galactic Plane Survey

(Molinari et al. 2010)

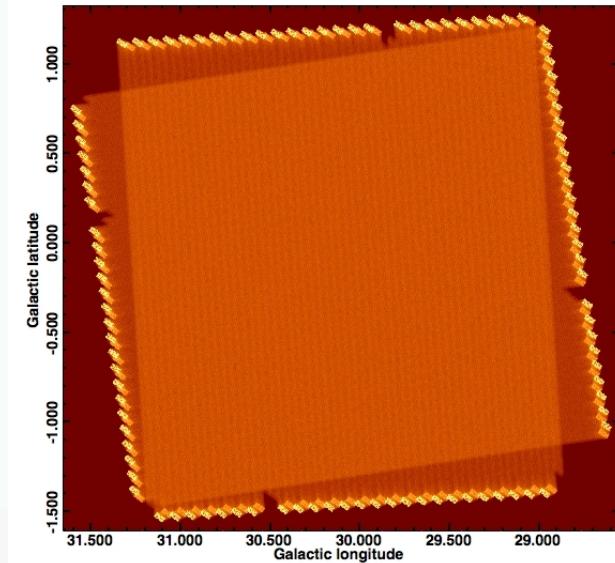
Each tile:

- $2^\circ \times 2^\circ$
- ~ 54 scan-legs (nominal+orthogonal)
- ~ 10-30 samples per pixel (depending from the map resolution)

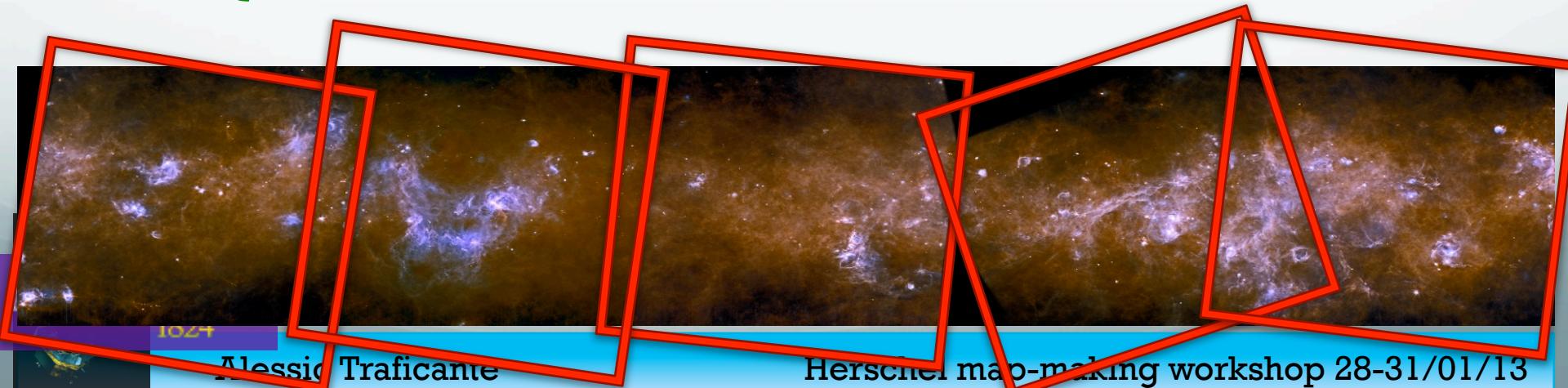
PIXELS

[

- ~ 3000 x 3000 (PACS 70 μ m)
- ~ 500 x 500 (SPIRE 500 μ m)



PACS 70 μ m $l=30$ coverage



Hi-GAL survey

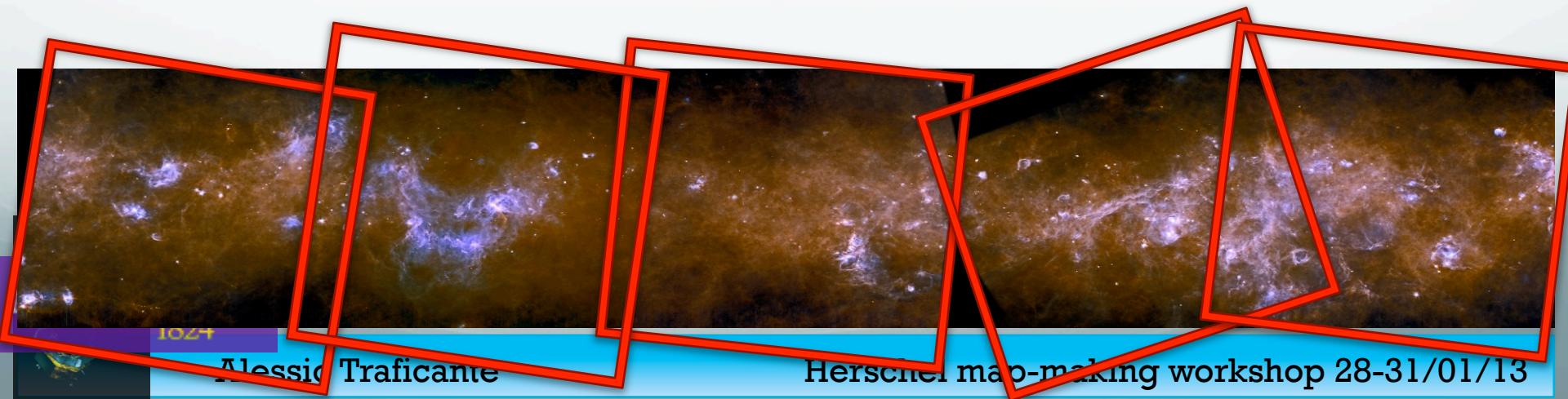
Hi-GAL Herschel Infrared Galactic Plane Survey

(Molinari et al. 2010)

More than 160 $2^\circ \times 2^\circ$ tiles

| PACS band (μm) | On-board freq. (Hz) | Data freq. (Hz) | Data per tile |
|-----------------------------|---------------------|-----------------|---------------------|
| 70 | 40 | 5 | $\sim 8 \text{ Gb}$ |
| 160 | 20 | 5 | $\sim 4 \text{ Gb}$ |

| SPIRE band (μm) | Data freq. (Hz) | Data per tile |
|------------------------------|-----------------|-----------------------|
| 250 | 10 | $\sim 0.8 \text{ Gb}$ |
| 350 | 10 | $< 0.5 \text{ Gb}$ |
| 500 | 10 | $< 0.5 \text{ Gb}$ |



MapMaking

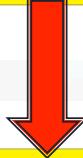
ROMAGAL tailored and developed for Hi-GAL “1”

63 tiles

$|b| < 1^\circ$

$-71^\circ < l < 66^\circ$

START



FINISH

RAW
data

Map

| Dimensions | $\sim Gb$ |
|------------|---|
| Contents | Signal+noise (systematics, glitches, statistical fluctuations, ...) |

| Dimensions | $\sim Mb$ |
|------------|---------------------------------------|
| Contents | Signal + residuals, ideally noiseless |

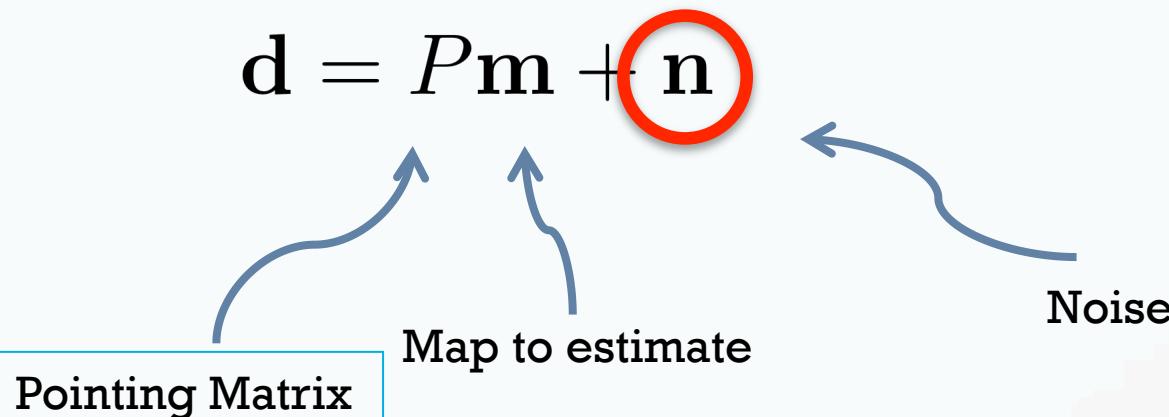
How to reduce data without loosing information? **Map Making**



MapMaking

For each Herschel bolometer, we can model the time ordered data (TOD) \mathbf{d} :

Very simple IF
beam is
circularly
symmetric



Modeling the noise \mathbf{n} is the key to estimate \mathbf{m}

\mathbf{n} depends from

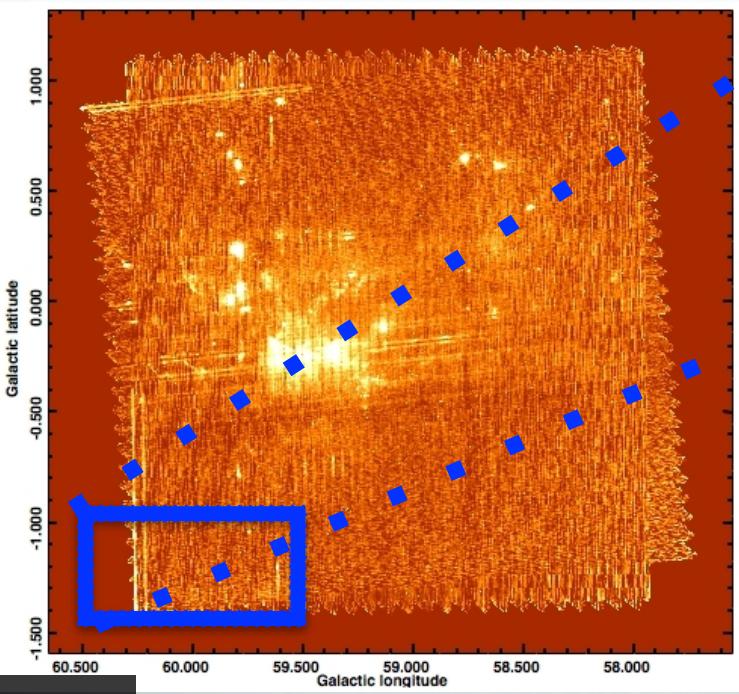
- Technical specification of the instruments
- Specifics of each survey (acquisition strategy, ...)

Understanding the noise: naïve map

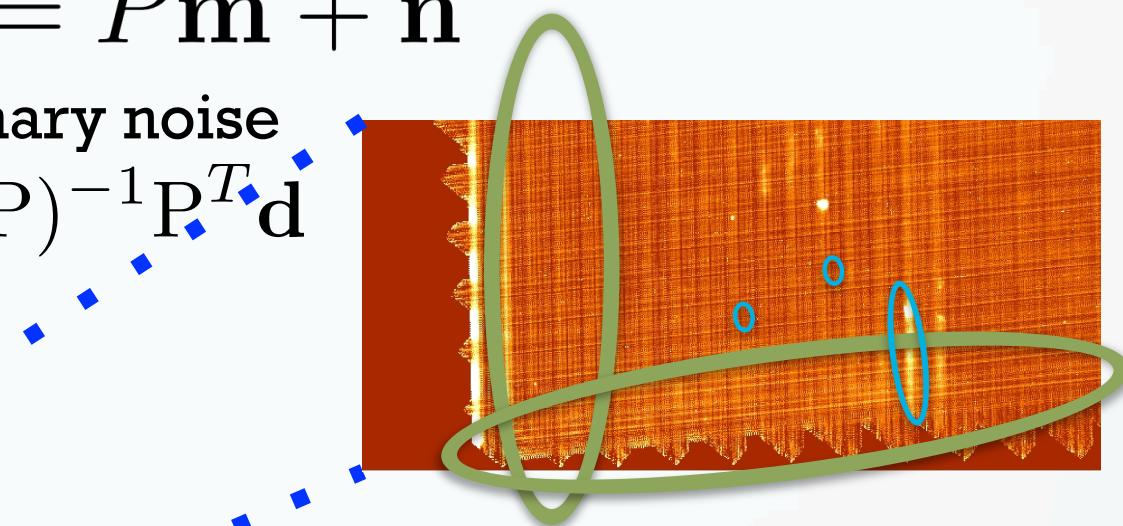
$$\mathbf{d} = \mathbf{P}\mathbf{m} + \mathbf{n}$$

\mathbf{n} → White and stationary noise

Naïve solution $\tilde{\mathbf{m}} = (\mathbf{P}^T \mathbf{P})^{-1} \mathbf{P}^T \mathbf{d}$



$l=59^\circ$ Hi-GAL
PACS 70 μ m



1. Systematics (drifts, ...)
2. Glitches
3. White noise
4. Correlated noise

ROMAGAL
pre-processing

ROMAGAL
algorithm

ROMAGAL pre-processing

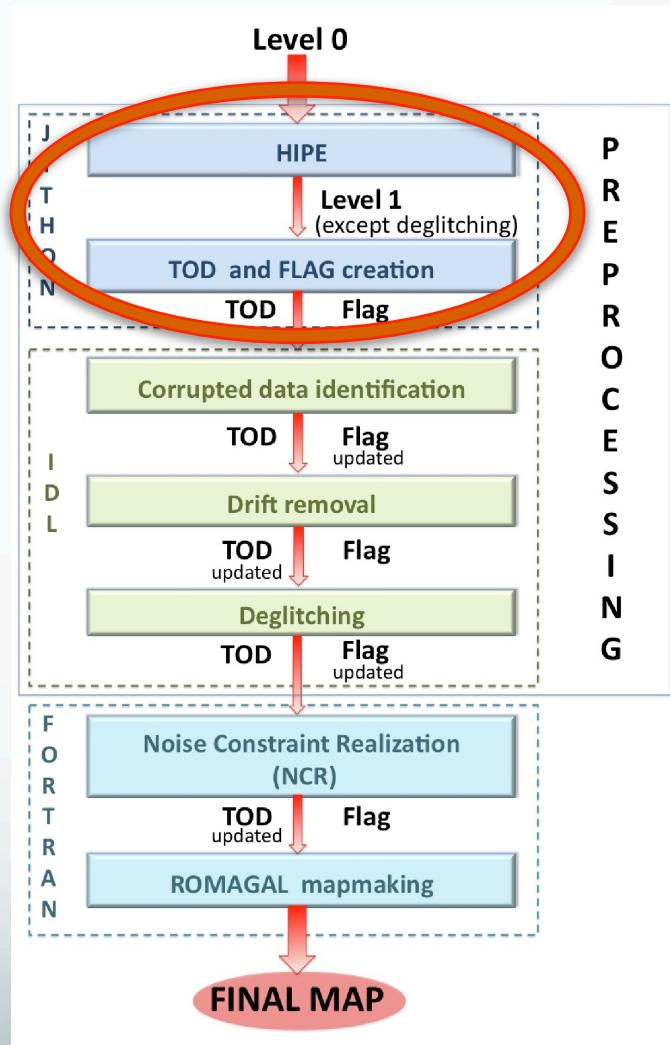
From Level 0 to Level 1: HIPE

- Conversion from ADU to physical unit

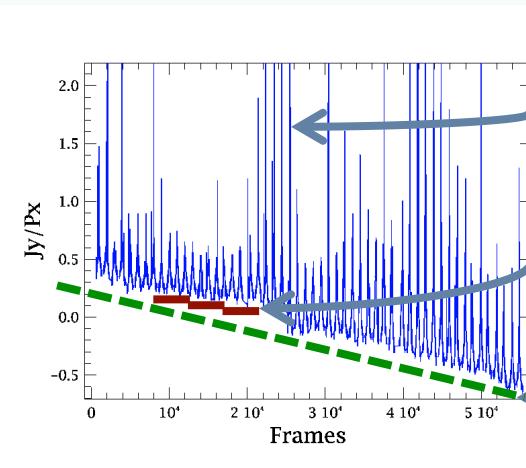
PACS Jy/px

SPIRE Jy/beam

- Pixel-to-pixel offset
- ...
- TOD creation for each PACS/SPIRE bolometer**



ROMAGAL pre-processing



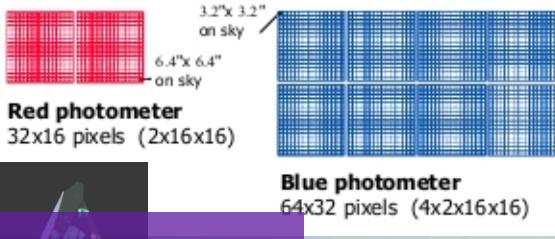
PACS 70 μ m TOD DRIFTS

- telescope drift
- electronic drift

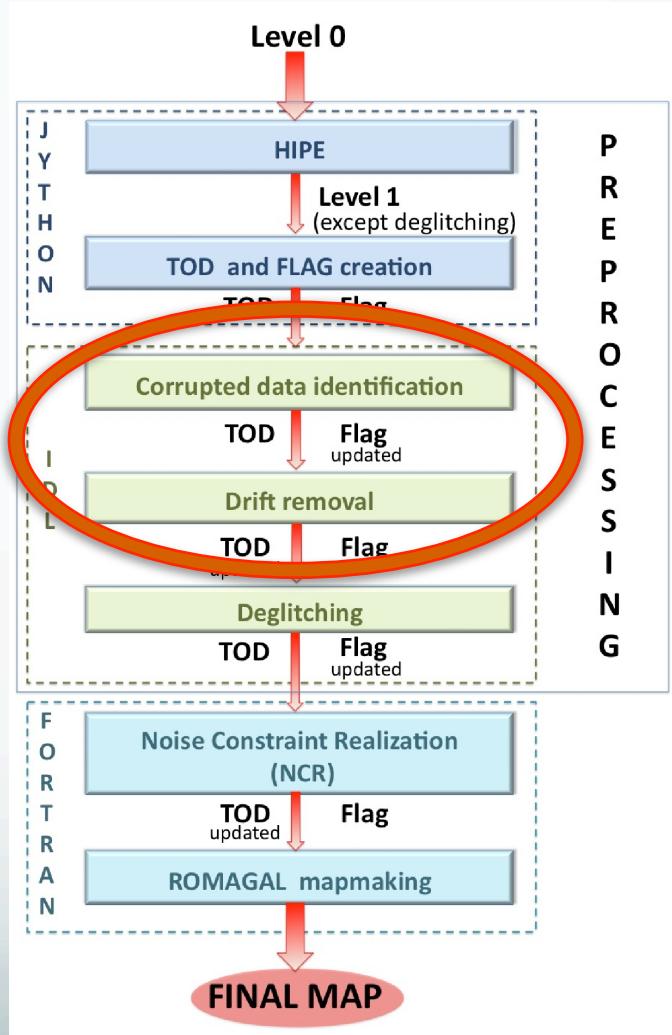
Signal
Scan-leg
Drift

Common to the entire array

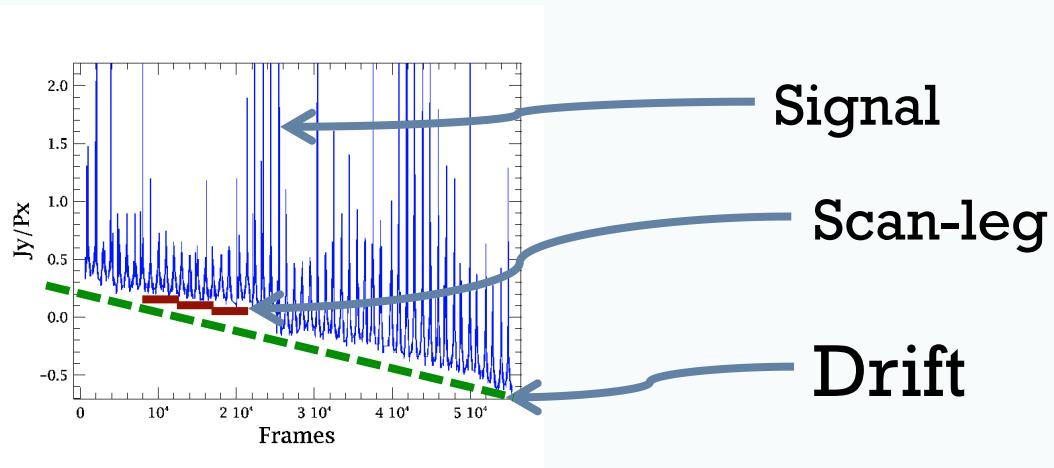
Different for each sub-array



250 μ m 350 μ m 500 μ m



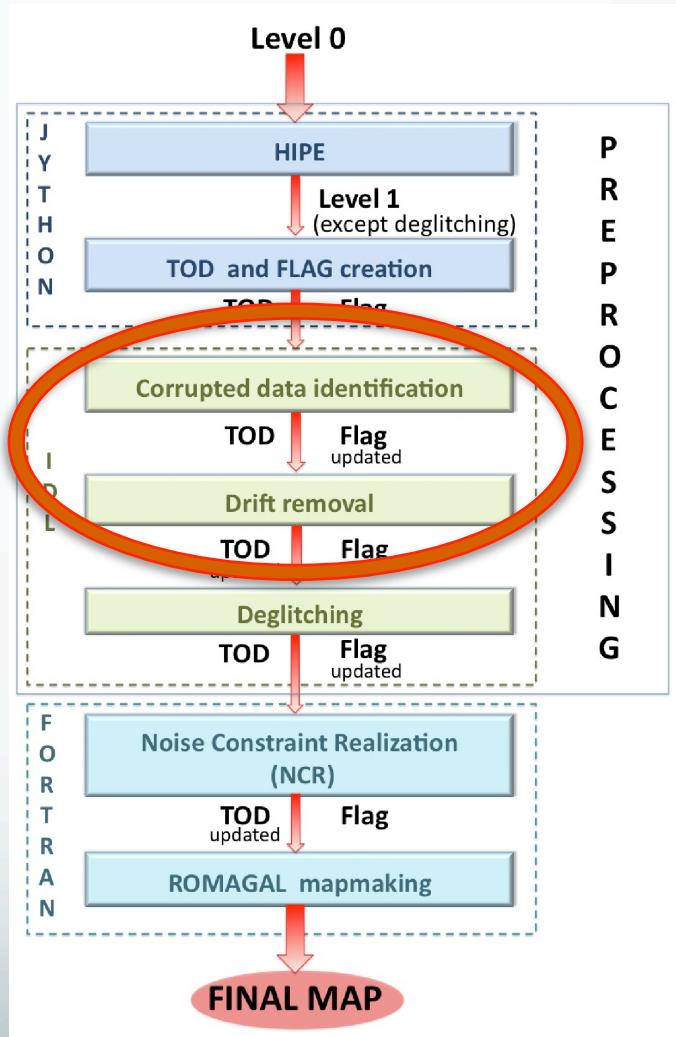
ROMAGAL pre-processing



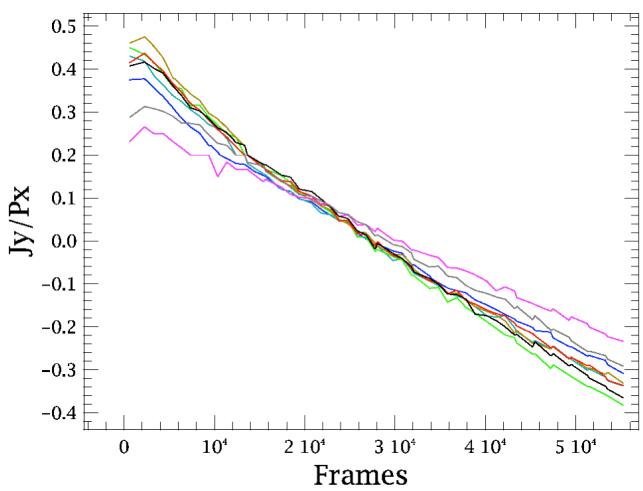
PACS 70 μ m TOD

For each sub-array

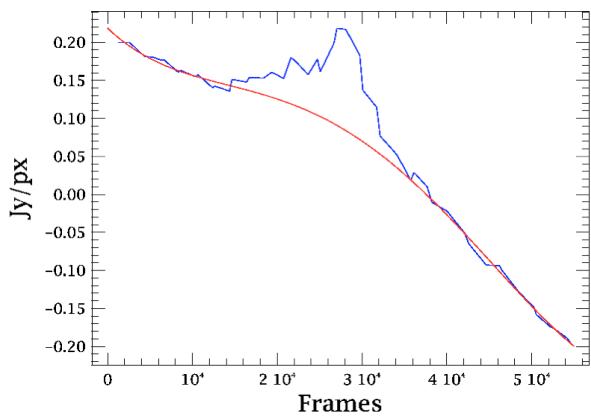
- TOD median value of each scan-leg
- Minimum median as representative of the drift
- Polynomial fit



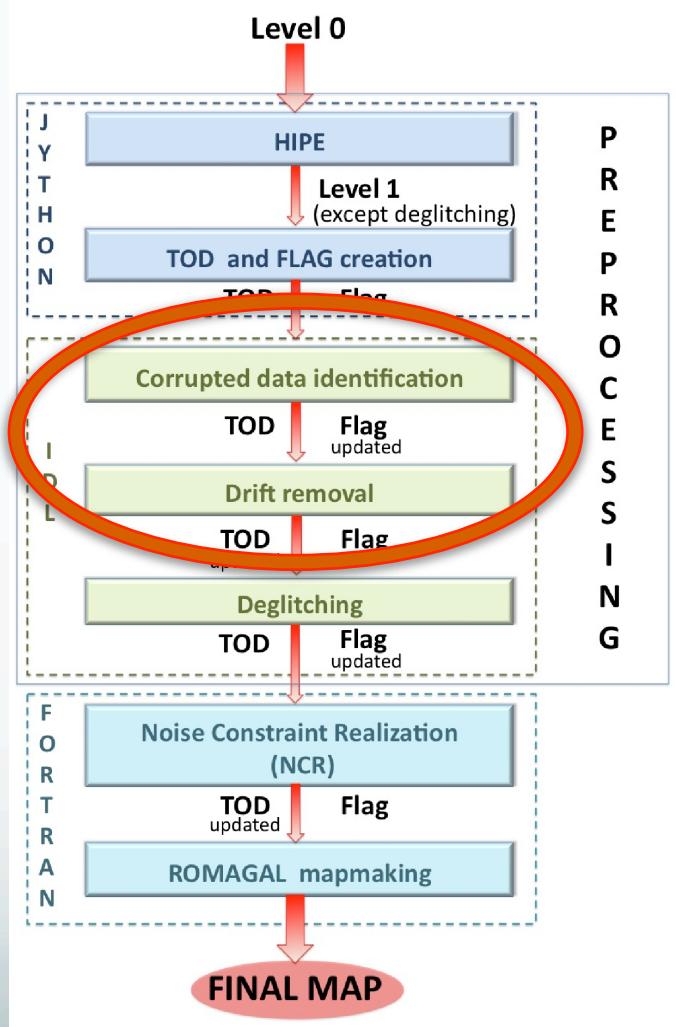
ROMAGAL pre-processing



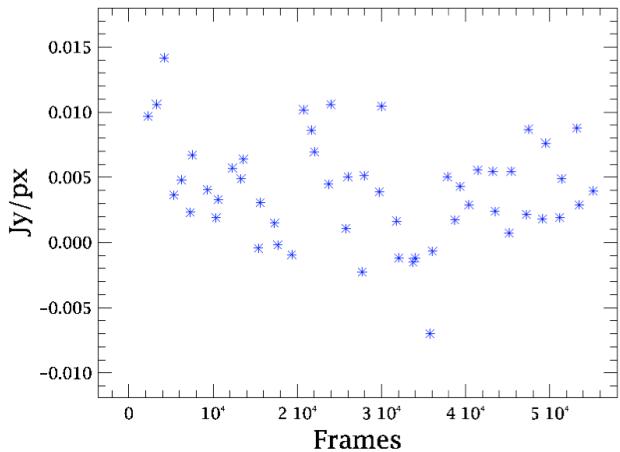
PACS 70 μ m
minima of median
for each sub-array



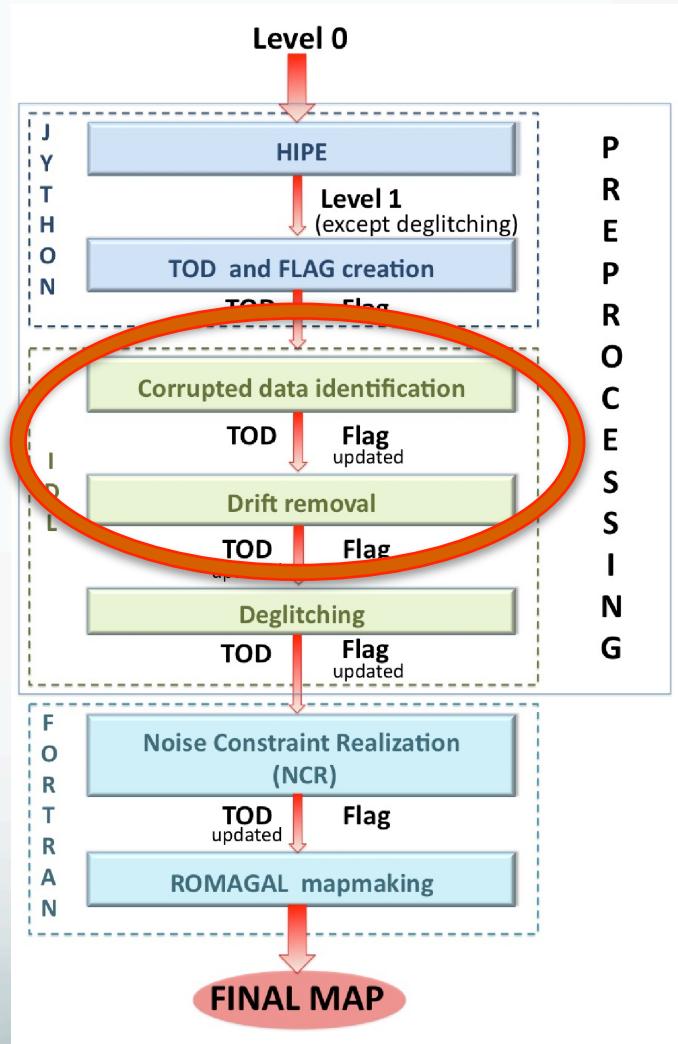
Scan parallel to the
Galactic Plane



ROMAGAL pre-processing



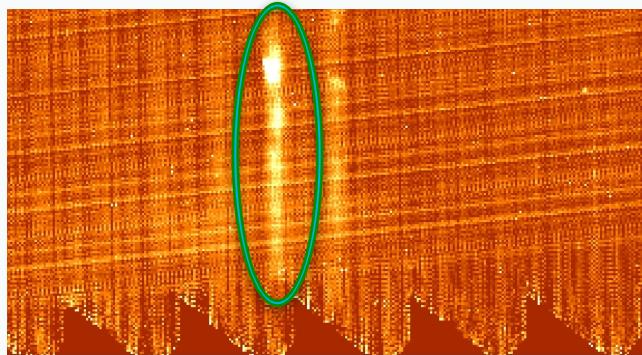
Minimum of the median residual after polynomial fit subtraction



ROMAGAL pre-processing

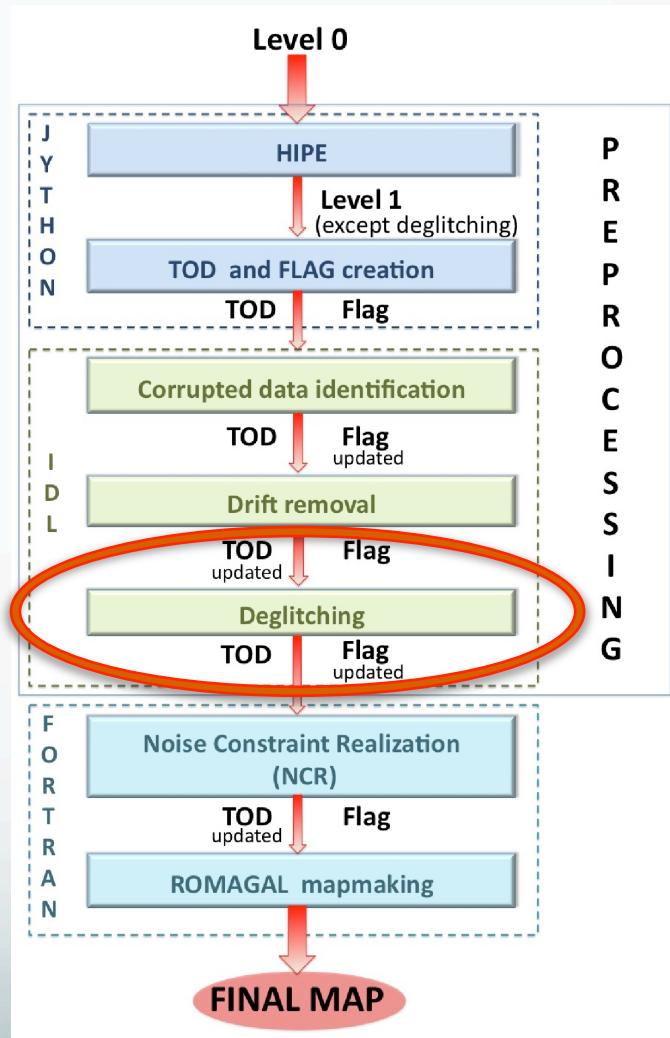
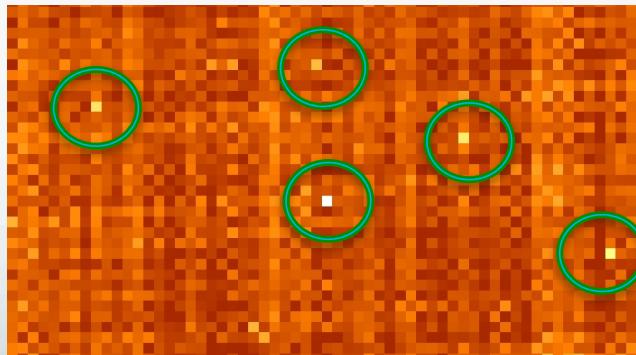
Glitches

Glitches which alter
the detector
responsivity



Spikes

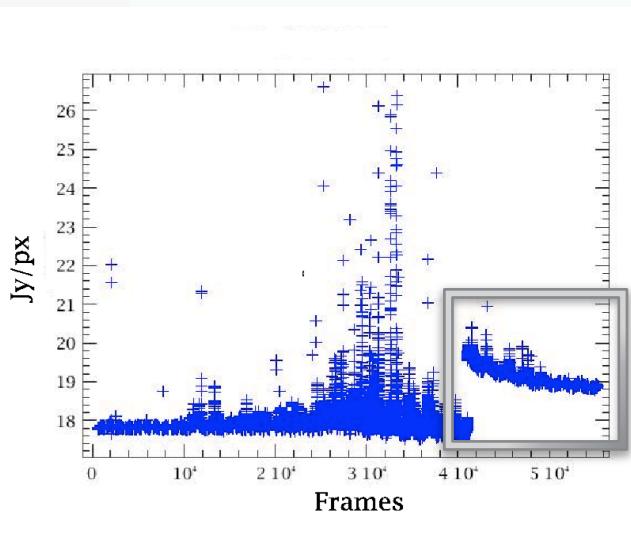
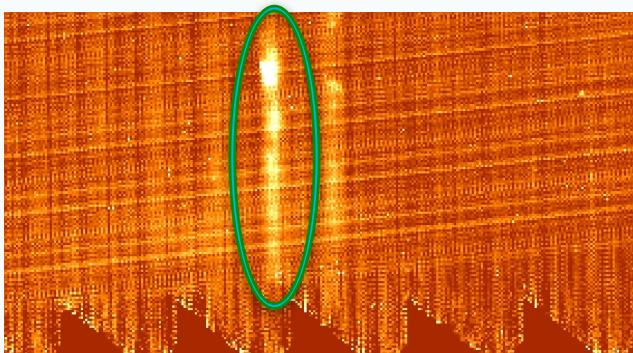
Affect only a
specific map pixel



ROMAGAL pre-processing

Glitches

Glitches which alter
the detector
responsivity

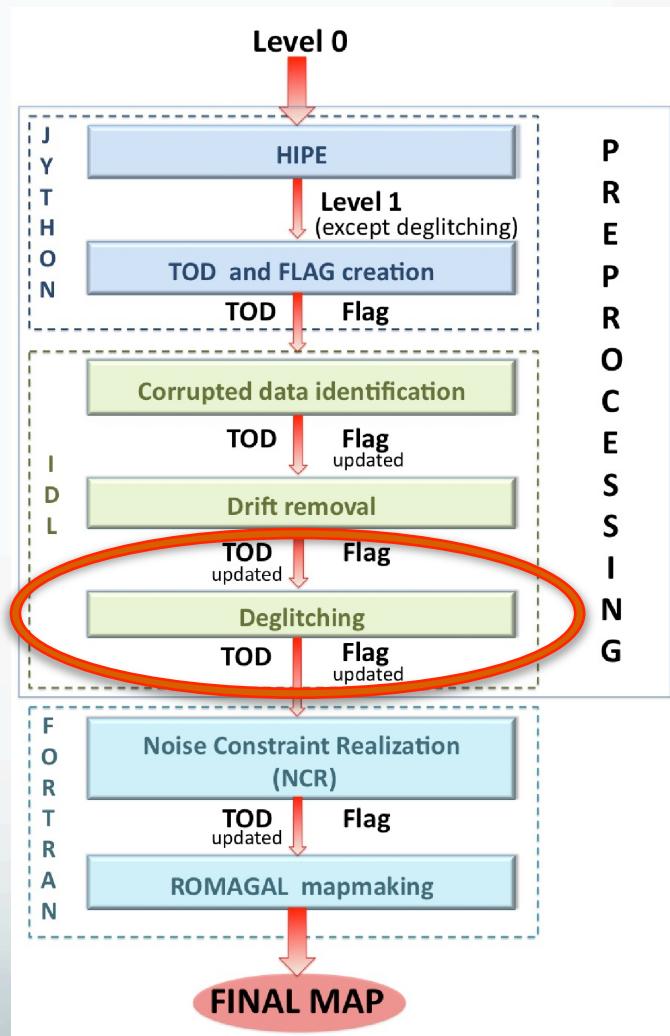


TOD affected by
powerful
glitch event:

- TOD first derivative to identify the “jump”
- exponential behavior

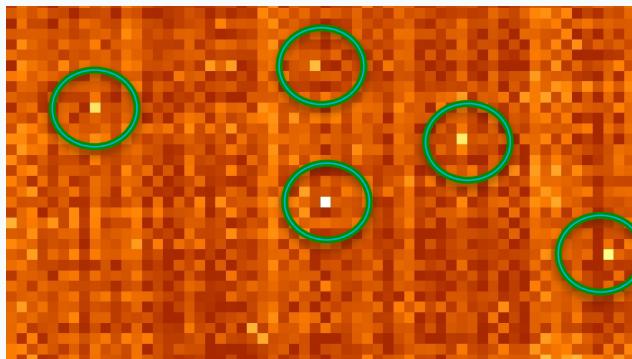


Flagged points



ROMAGAL pre-processing

Spikes



PACS

IDL algorithm

SPIRE

Standard MMT + IDL algorithm

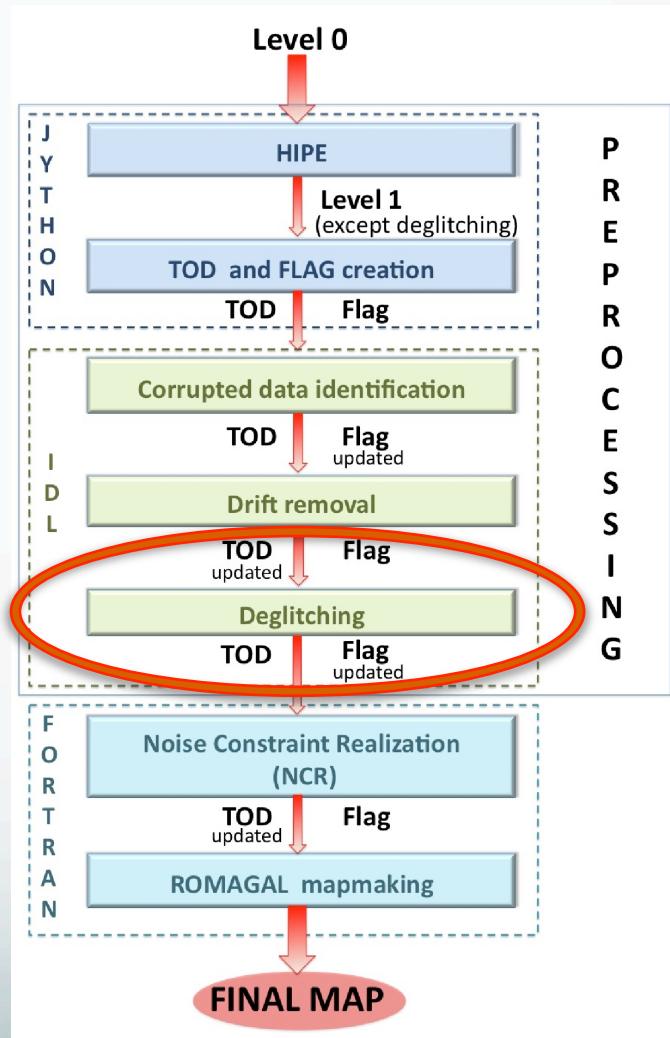
IDL algorithm: sigma clipping on spatial redundancy

$$n \text{ sigma} = -0.569 + \sqrt{-0.072 + 4.99 \log(N)}$$

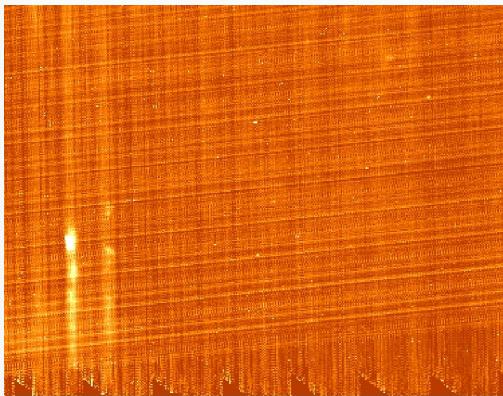
Derived by S. Pezzuto

N hits per pixel

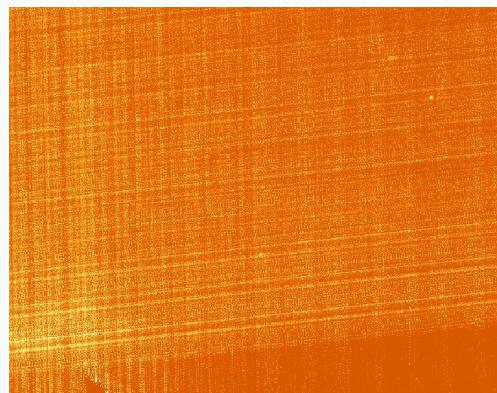
~ 5-10% of data **flagged** as glitches



ROMAGAL NCR



PACS 70 μ m naïve
from raw-data

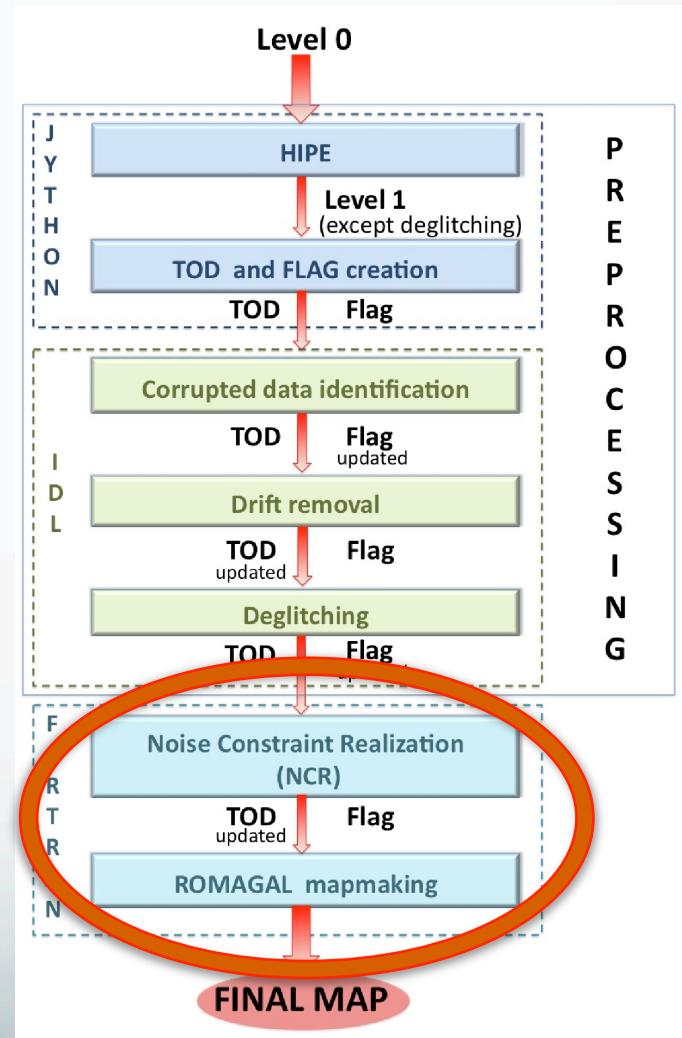


PACS 70 μ m naïve
after pre-processing

Survived: white noise
1/f noise

ROMAGAL
algorithm

But first: how to manage flagged data?



ROMAGAL pipeline

Main ROMAGAL assumption

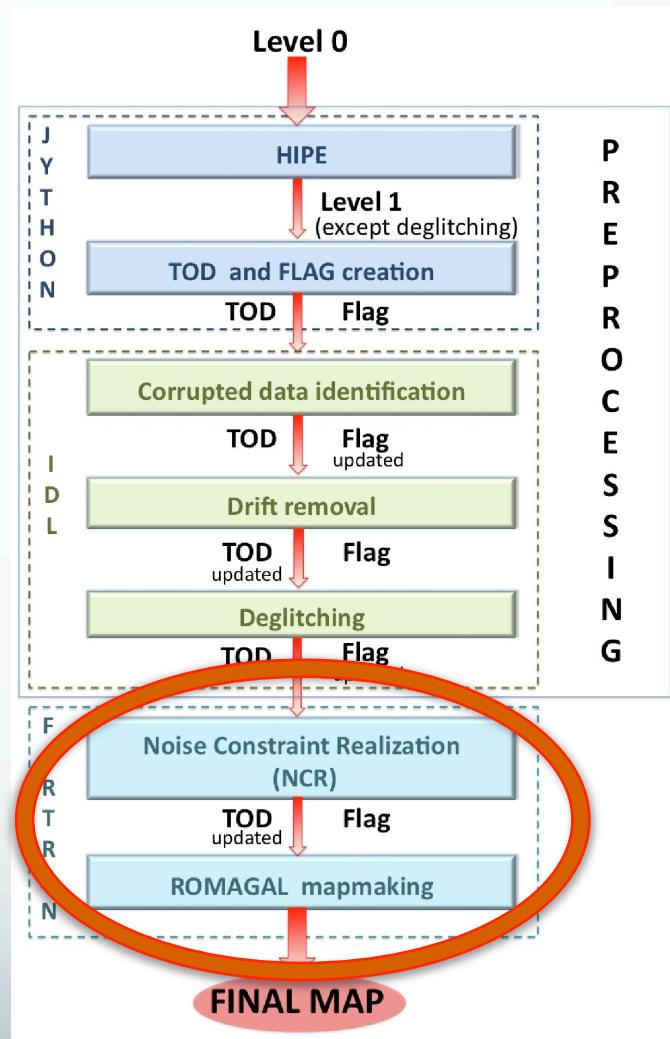
1. The noise \mathbf{n} is Gaussian distributed and with a null average
2. The noise \mathbf{n} is piecewise stationary
3. The pure signal does not change with time over the sky

From 1-2

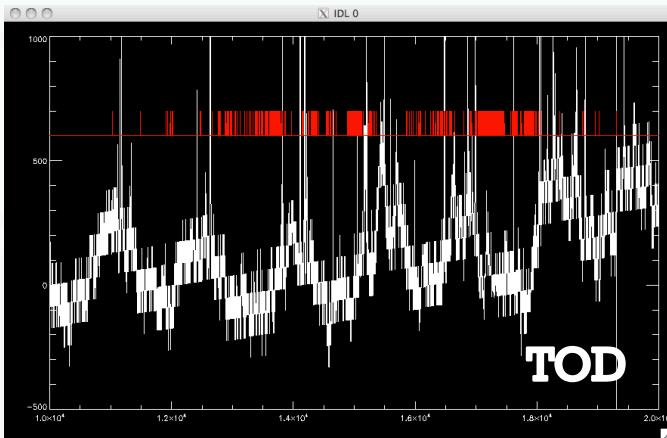
Noise has to be constrained

From 3

TODs require continuity



ROMAGAL pipeline



Flagged points

How to substitute the flagged data ?

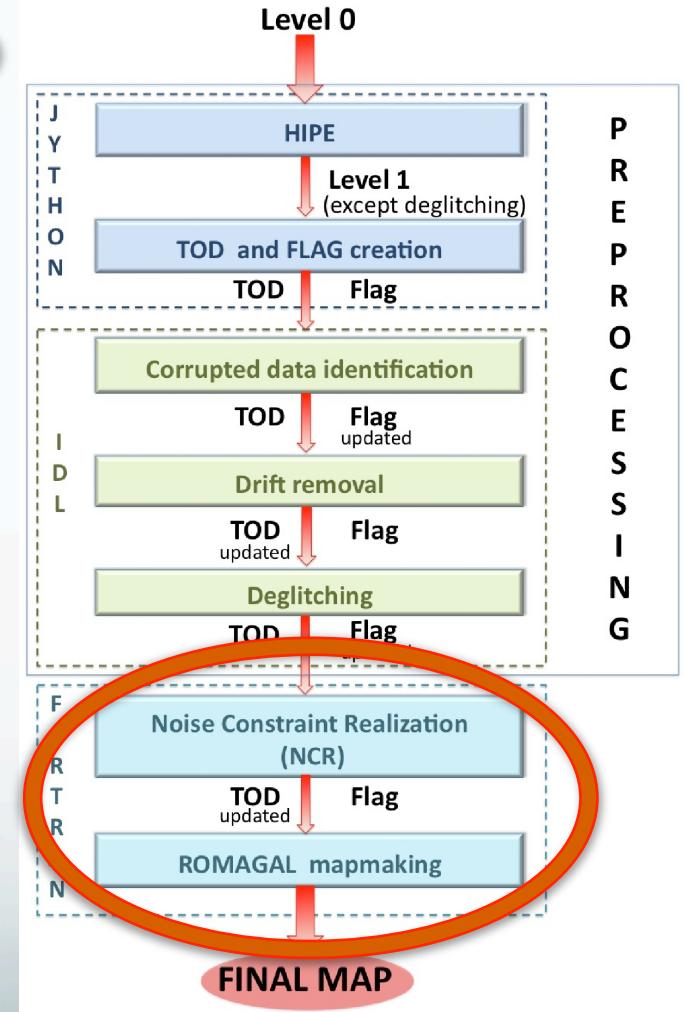


Simplest solution

Optimal solution

Null value

**Noise Constraint
Realization**



ROMAGAL NCR

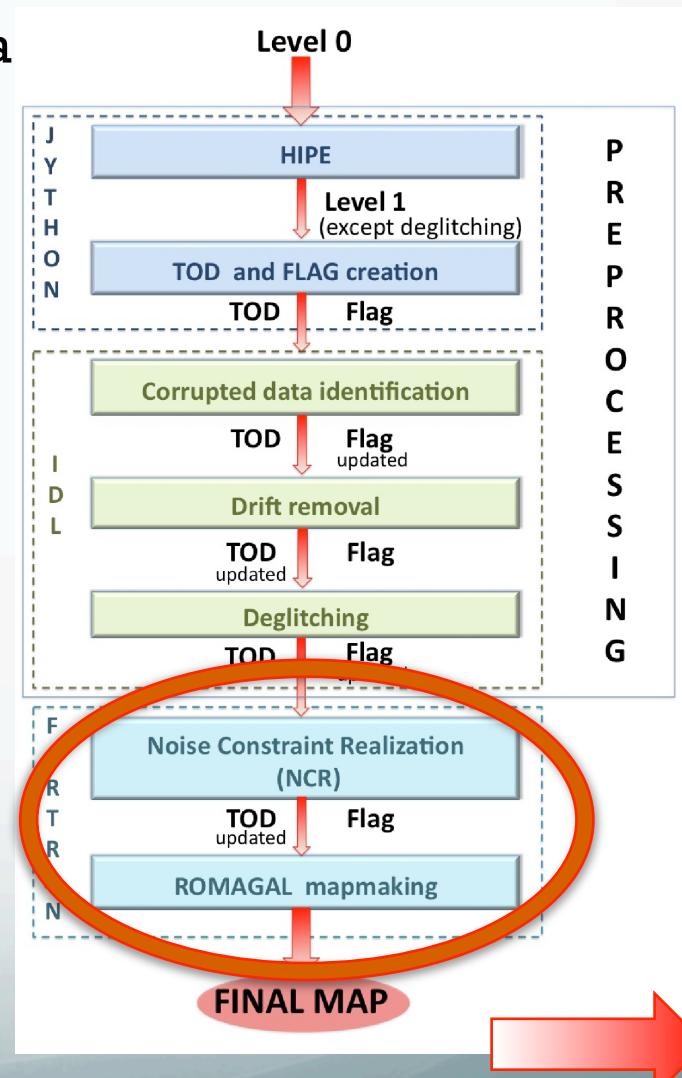
Simulations of 1/f noise with 10% of flagged data



Null value
(Breaks hyp. 1-2-3)



Alessio Traficante



Herschel map-making workshop 28-31/01/13

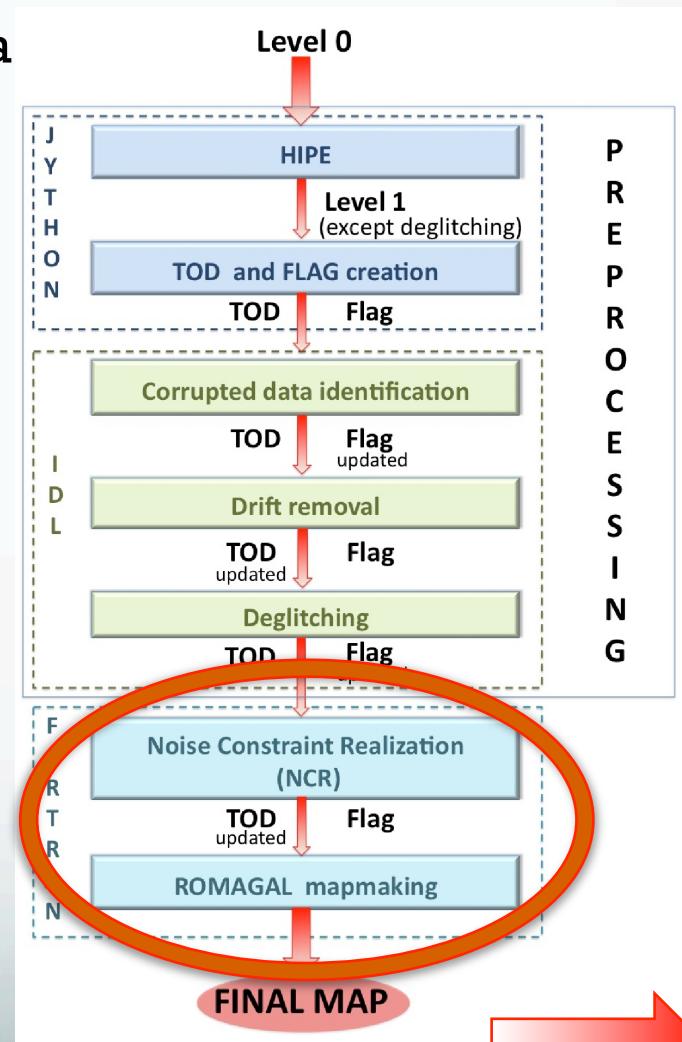
ROMAGAL NCR

Simulations of 1/f noise with 10% of flagged data



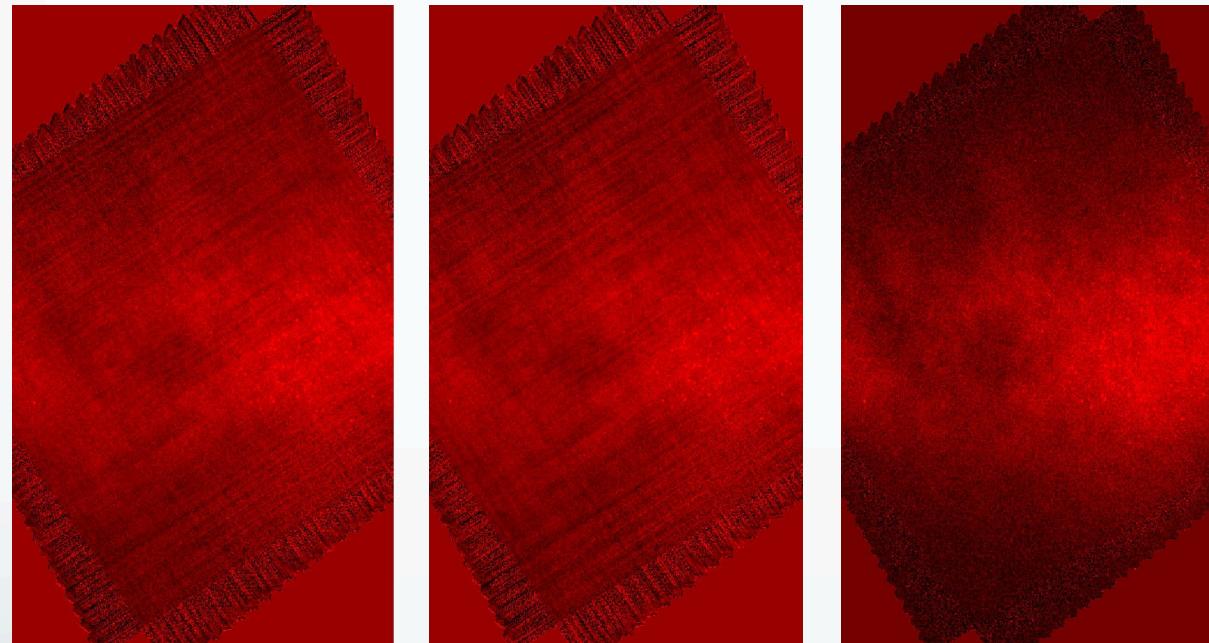
Null value
(Breaks hyp. 1-2-3)

Statistical noise
properties
preserved (NR)
(Breaks hyp. 3)



ROMAGAL NCR

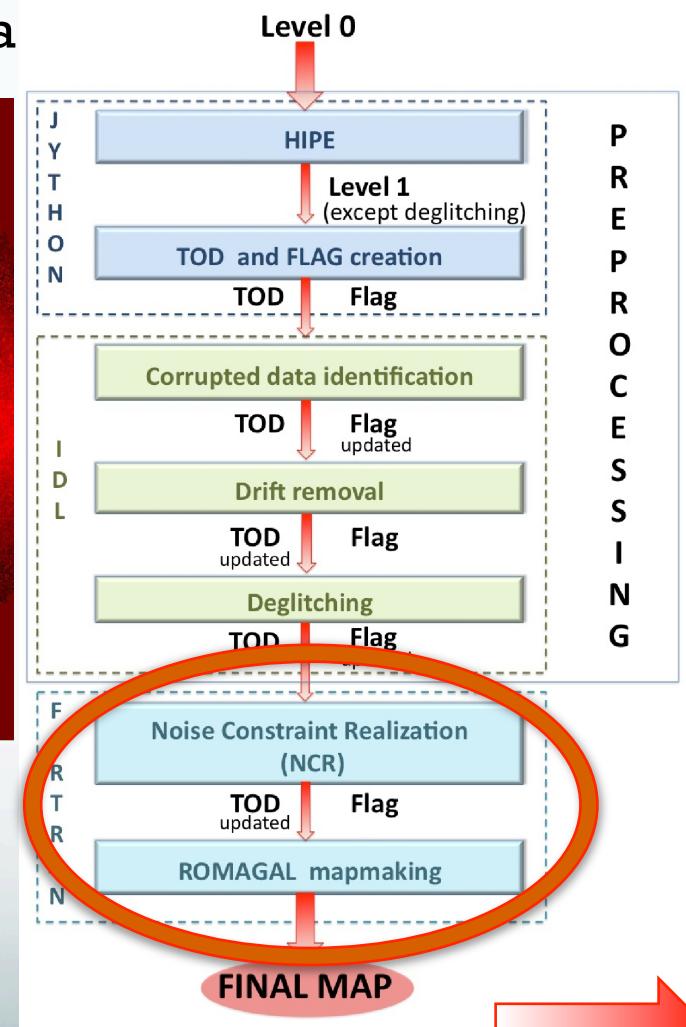
Simulations of 1/f noise with 10% of flagged data



Null value
(Breaks hyp. 1-2-3)

Statistical noise
properties
preserved (NR)
(Breaks hyp. 3)

Boundary
conditions
preserved
(NCR)



ROMAGAL MapMaking

- The noise \mathbf{n} is piecewise stationary
 - The noise \mathbf{n} is Gaussian distributed and with a null average
 - The pure signal does not change with time over the sky
- $\} \langle \mathbf{n} \rangle = 0$

We can estimate the best map, solving the system $\mathbf{d} = P\mathbf{m} + \mathbf{n}$ via **GLS** (Generalized Least Square) solution

$$\tilde{\mathbf{m}} = (P^T \mathbf{N}^{-1} P)^{-1} P^T \mathbf{N}^{-1} \mathbf{d}$$

$\mathbf{N} = \langle \mathbf{n} \mathbf{n}^T \rangle$ Noise Correlation matrix (NON-diagonal)

$\tilde{\mathbf{m}}$ is

- unbiased
- optimal minimum variance estimator
- Maximum Likelihood estimator

ROMAGAL implementation

GLS solution $\tilde{\mathbf{m}} = (P^T N^{-1} P)^{-1} P^T N^{-1} \mathbf{d}$

This matrix is $n \sim 10^7$

Inversion scales as n^3

$n = 10^{21}$

operations
requires
 ~ 100 days...



...on TITAN!!!

Nº 1 supercomputer to date
 ~ 500.000 processors
 ~ 50 petaflops (10^{15} oper./s)
peak performance

We should find some smart workaround....



ROMAGAL implementation

GLS solution

$$\tilde{\mathbf{m}} = (P^T \mathbf{N}^{-1} P)^{-1} P^T \mathbf{N}^{-1} \mathbf{d}$$

Real implementation

$$(\mathbf{P}^T \mathbf{N}^{-1} \mathbf{P}) \tilde{\mathbf{m}} = \mathbf{P}^T \mathbf{N}^{-1} \mathbf{d}$$

Why?  N is stationary

Noise properties does not change over the observation time

N is ~ **circulant** matrix

$$\mathbf{N}_{i+1,j+1} = \mathbf{N}_{i,j}$$

Circulant matrix is **DIAGONAL** in Fourier space

The inversion of a diagonal $n \times n$ matrix scales as **n** !

ROMAGAL noise filters

DIRECT space



Fourier space

Correlation matrix

N



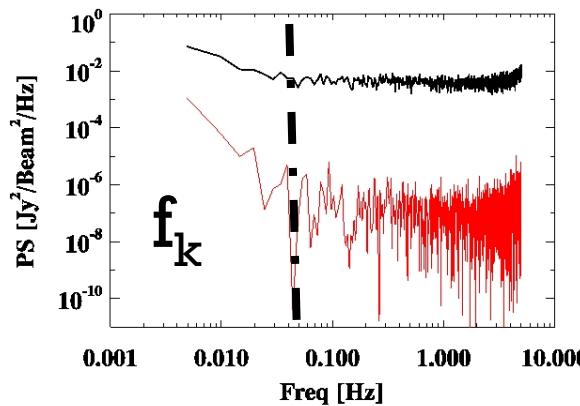
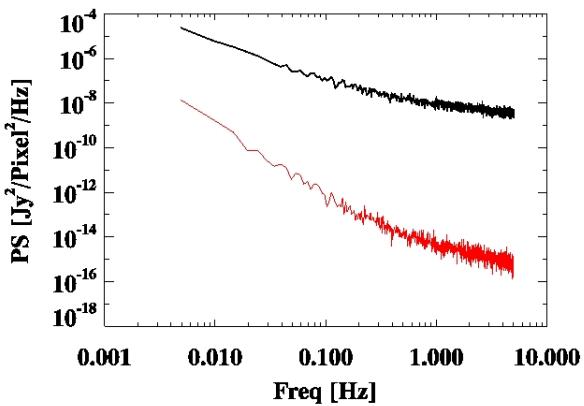
Noise power spectrum

Inverse of correlation matrix N^{-1}



Noise filter

Noise filters can be estimated from REAL data. They depend from the intrinsic noise properties of each specific detector 1 noise filter per bolometer



Blank data
(Thanks to G. Pilbratt)

- Auto spectrum
- Cross spectrum

f_k = knee frequency

white noise dominate the 1/f noise

ROMAGAL implementation

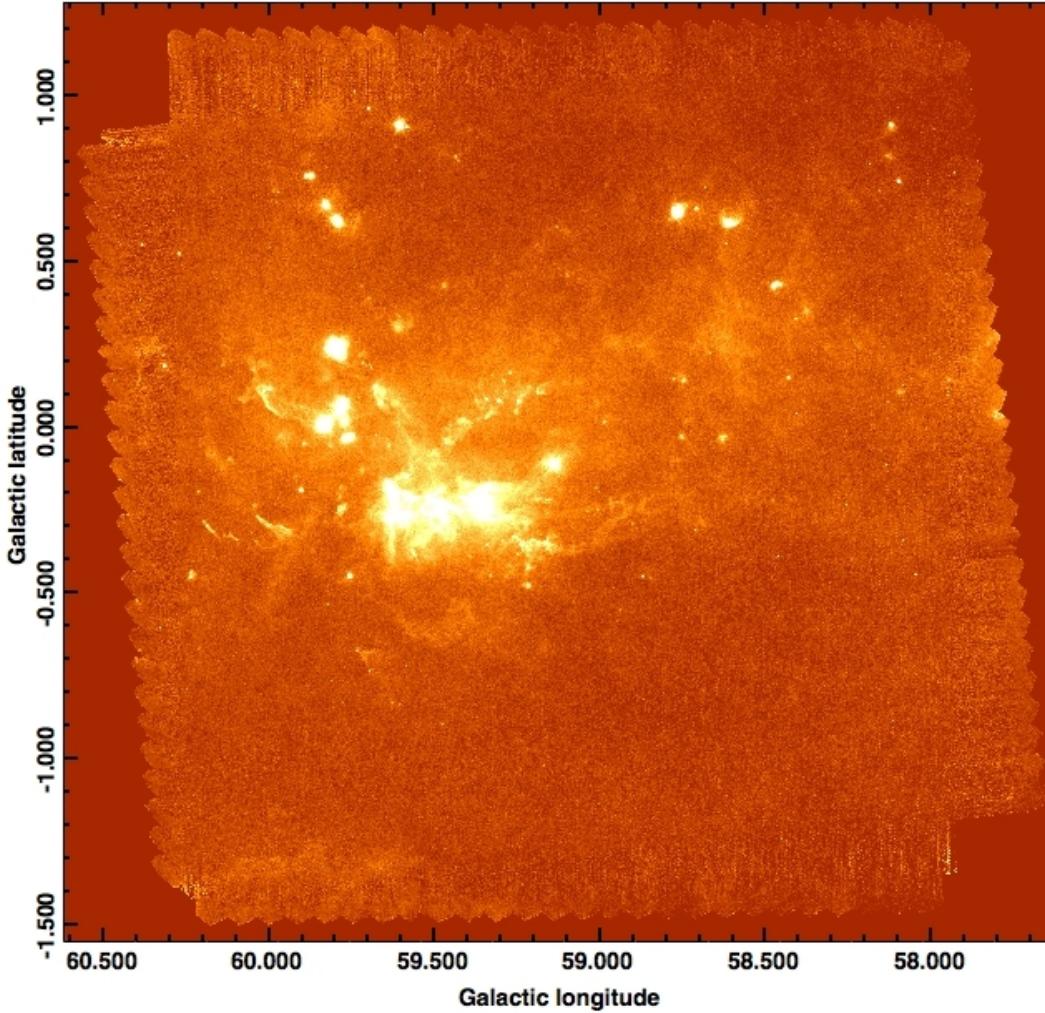
Real implementation $(P^T N^{-1} P) \tilde{m} = P^T N^{-1} d$

- Parallel FORTRAN 90/95 code based on MPI libraries
- FFT routines
- Iterative methods (Conjugate Gradient - CG) that converges in few iterations to solve the system



PACS 70 μm map of a $2^\circ \times 2^\circ$ Hi-GAL field:
~ 20 mins on 8 x 2.5 GHz cores

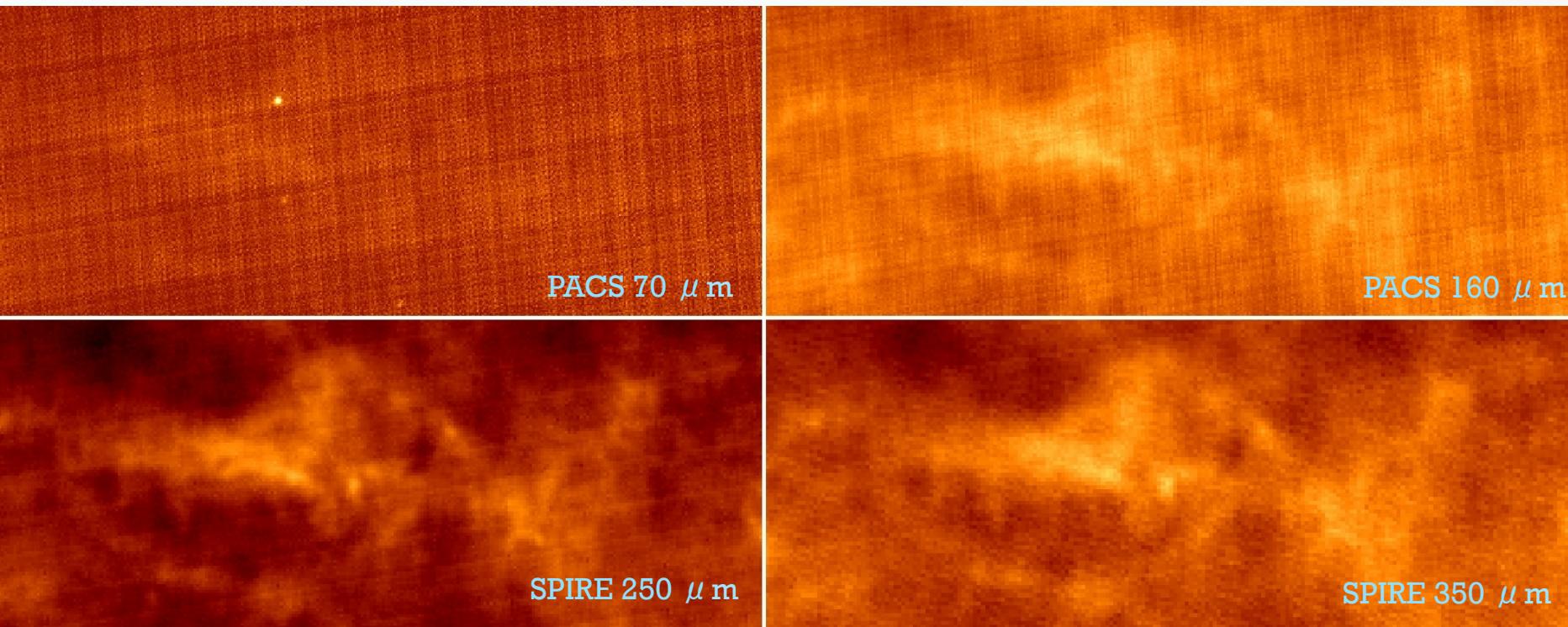
ROMAGAL map



Hi-GAL (l, b) = $(59^\circ, 0^\circ)$ PACS 70 μ m

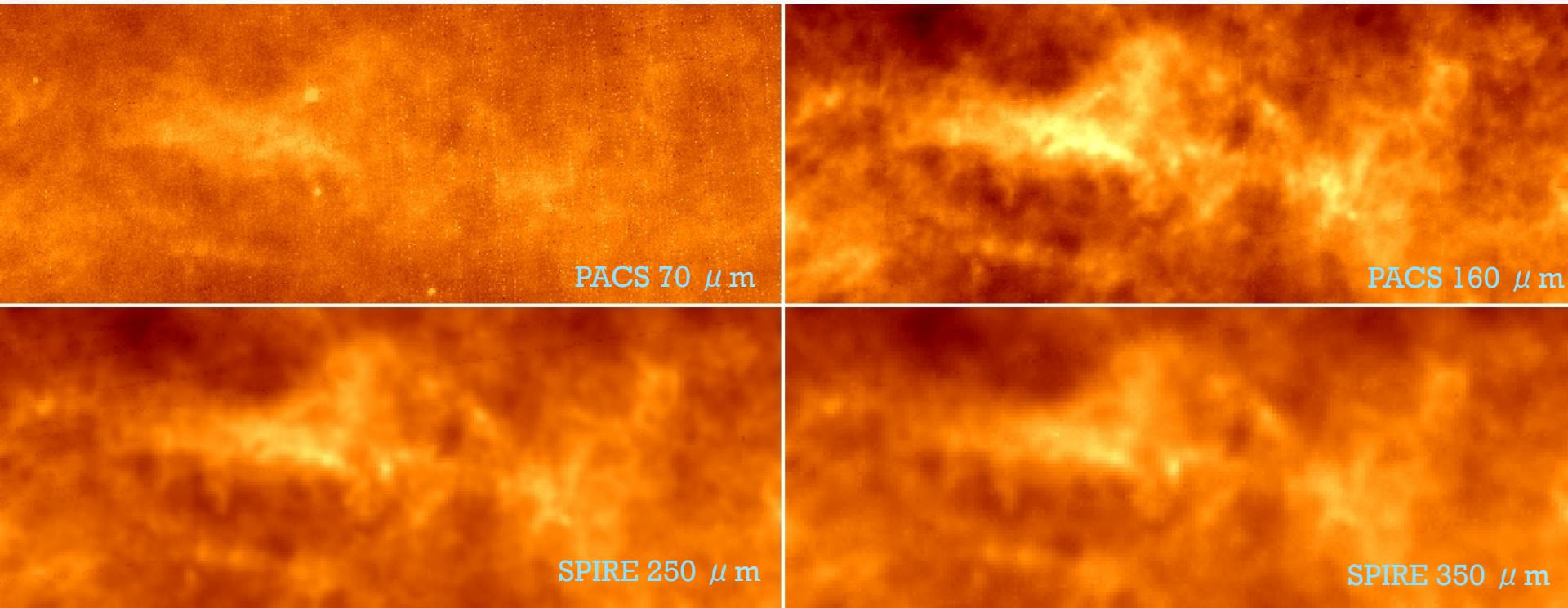
ROMAGAL map

Hi-GAL $l=030$ naïve



ROMAGAL map

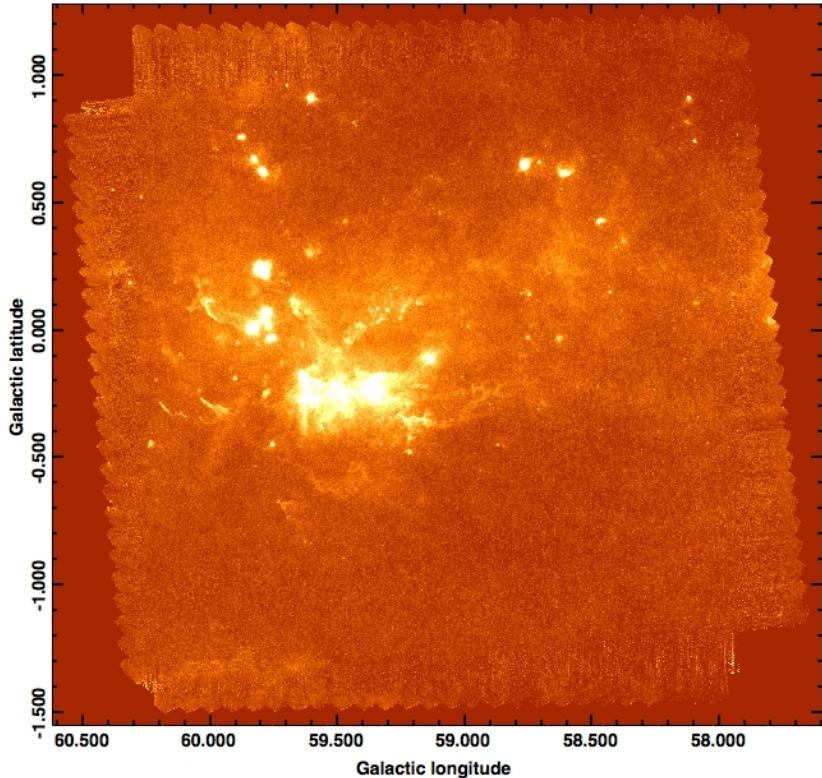
Hi-GAL $l=030$ GLS



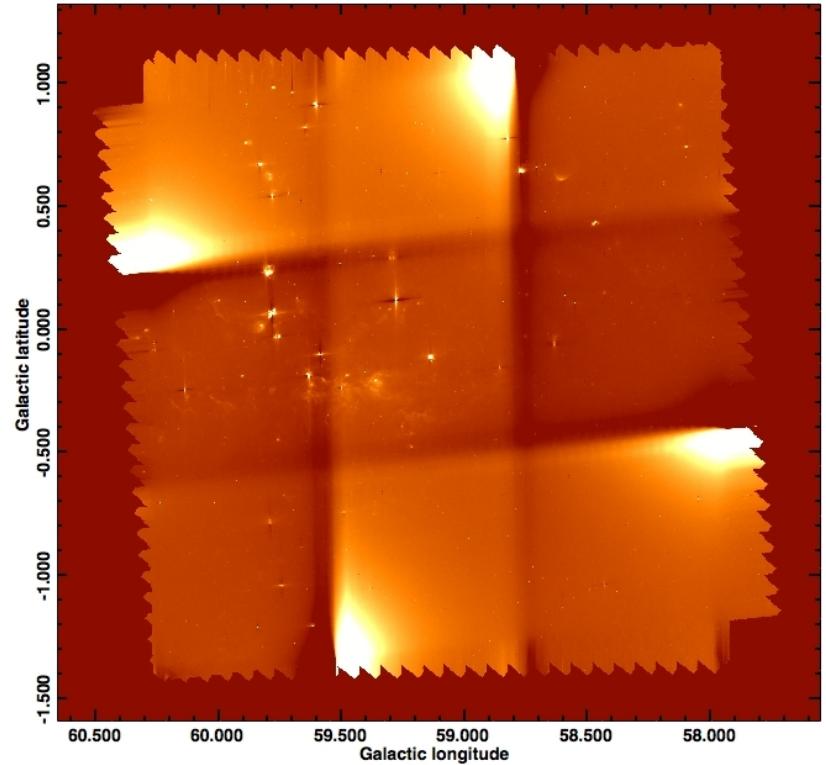
ROMAGAL map

Pre-processing is DEMANDING

WITH pre-processing



WITHOUT pre-processing



ROMAGAL map

PACS $I = 30^\circ$ field

| Band | rms igls (Jy/pixel) | rms naive(Jy/pixel) | ratio |
|-------|----------------------|----------------------|-------|
| 70μm | 0.0085 | 0.026 | ~ 3.1 |
| 160μm | 0.047 | 0.102 | ~ 2.2 |

PACS $I = 59^\circ$ field

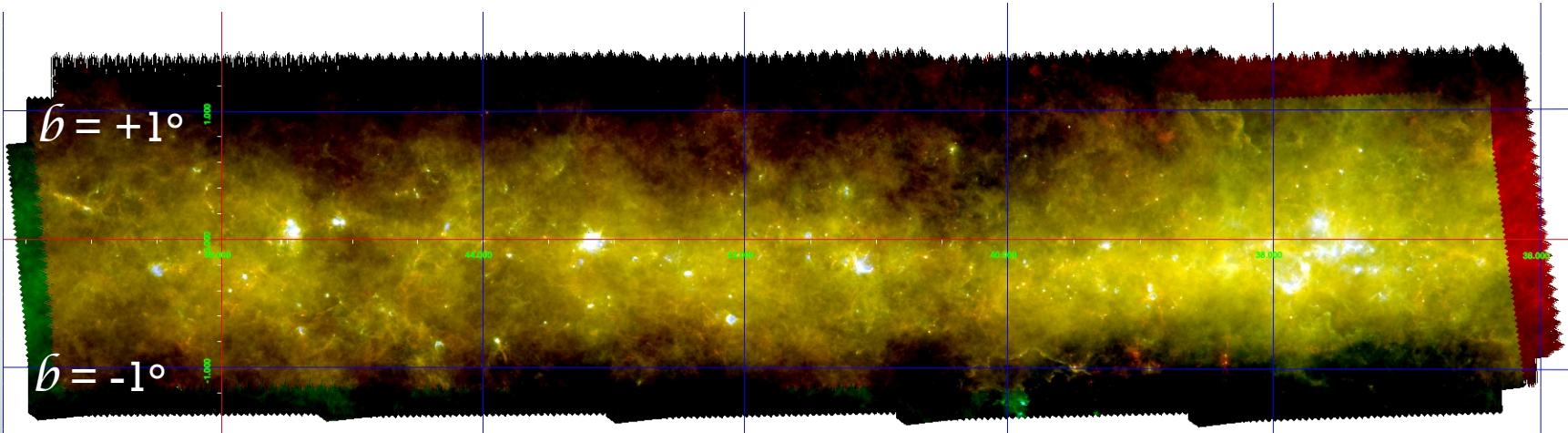
| Band | rms igls (Jy/pixel) | rms naive(Jy/pixel) | ratio |
|-------|----------------------|----------------------|-------|
| 70μm | 0.004545 | 0.02208 | ~ 4.9 |
| 160μm | 0.01899 | 0.03586 | ~ 1.9 |

SPIRE $I = 30^\circ$ field

| Band | rms igls (Jy/beam) | rms naive(Jy/beam) | ratio |
|-------|---------------------|---------------------|-------|
| 250μm | 0.1749 | 0.2868 | ~ 1.6 |
| 350μm | 0.1569 | 0.2302 | ~ 1.5 |
| 500μm | 0.2659 | 0.4065 | ~ 1.5 |

SPIRE $I = 59^\circ$ field

| Band | rms igls (Jy/beam) | rms naive(Jy/beam) | ratio |
|-------|---------------------|---------------------|-------|
| 250μm | 0.09857 | 0.1123 | ~ 1.1 |
| 350μm | 0.0734 | 0.08164 | ~ 1.1 |
| 500μm | 0.1073 | 0.2101 | ~ 1.9 |



46°

44°

42°

40°

$\ell = 38^\circ$

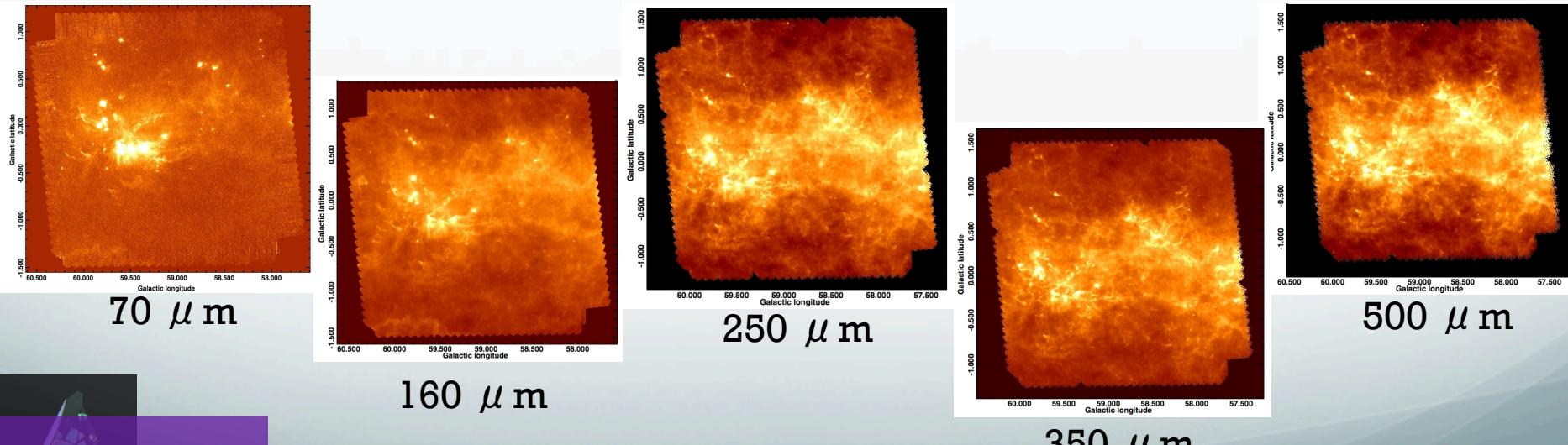
MANCHESTER
1824

Alessio Traficante

Herschel map-making workshop 28-31/01/13

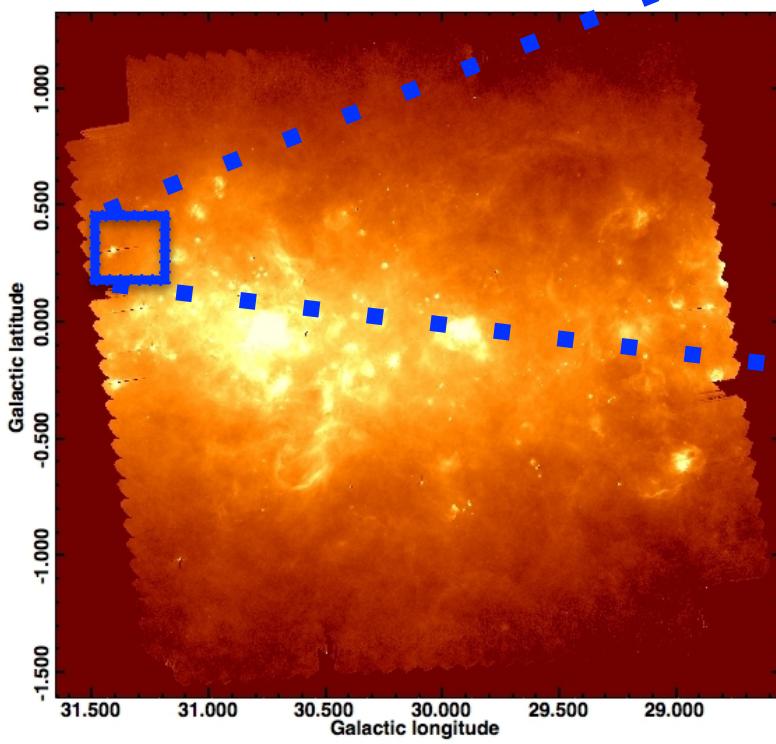
ROMAGAL map

| Band | Nominal beam (") | Pixel size (") | Tot pixel |
|-------------|-------------------------|-----------------------|------------------|
| PACS 70 | 5.2 | 3.2 | ~ 1700x1700 |
| PACS 160 | 12.0 | 4.5 | ~ 1200 x 1200 |
| SPIRE 250 | 18.0 | 6.0 | ~ 1000 x 1000 |
| SPIRE 350 | 24.0 | 8.0 | ~ 700 x 700 |
| SPIRE 500 | 34.5 | 11.5 | ~ 500 x 500 |

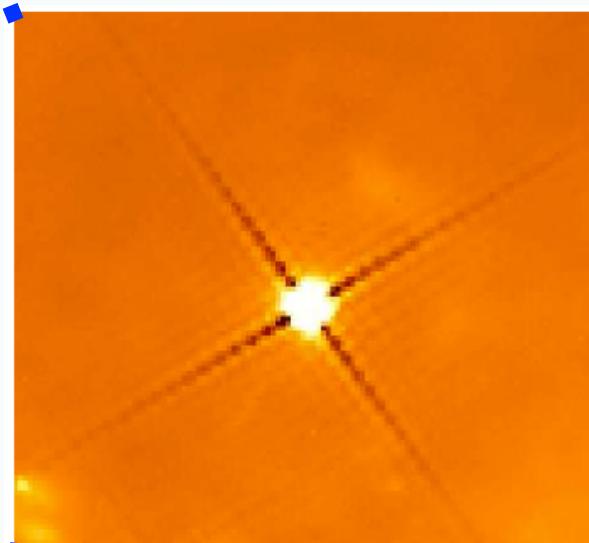


ROMAGAL map

...but still some problems



PACS 70 μ m

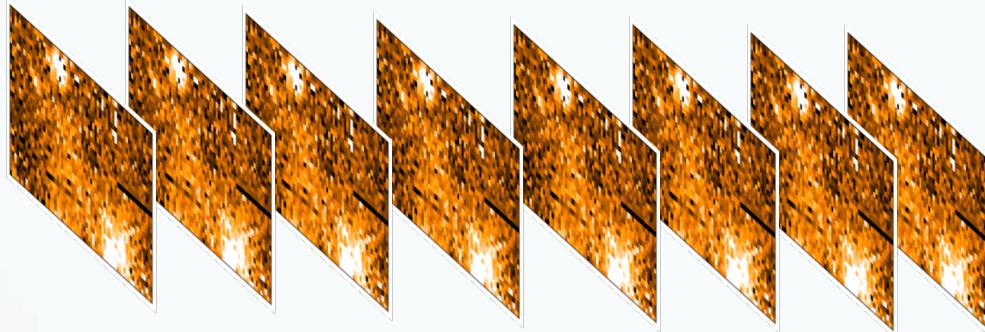


Pixellation noise

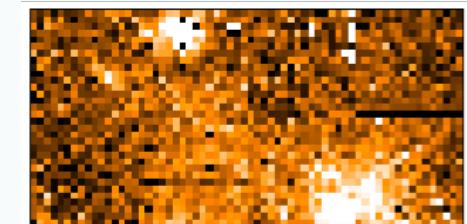
- Time bolometer response
- Relative pointing error
- **Coaddiction**
- ...

Co-addiction

PACS 70 μ m on-board sample: 40 Hz

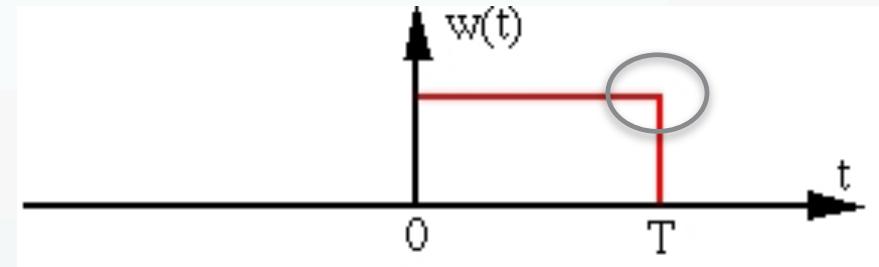


PACS 70 μ m data: 5 Hz

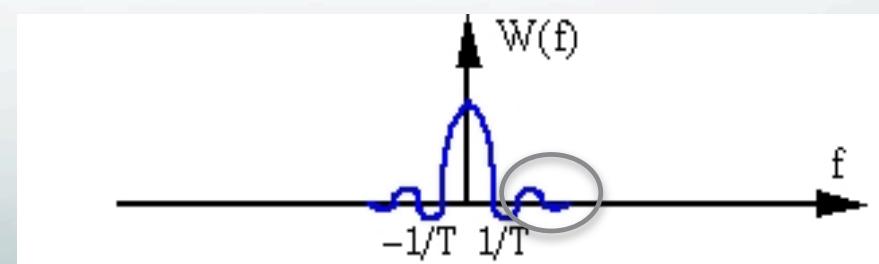


This is a (one of the) problem for ROMAGAL and all Fourier-based algorithms :

Co-addiction in time-space :
convolution of TOD with a
box-like function

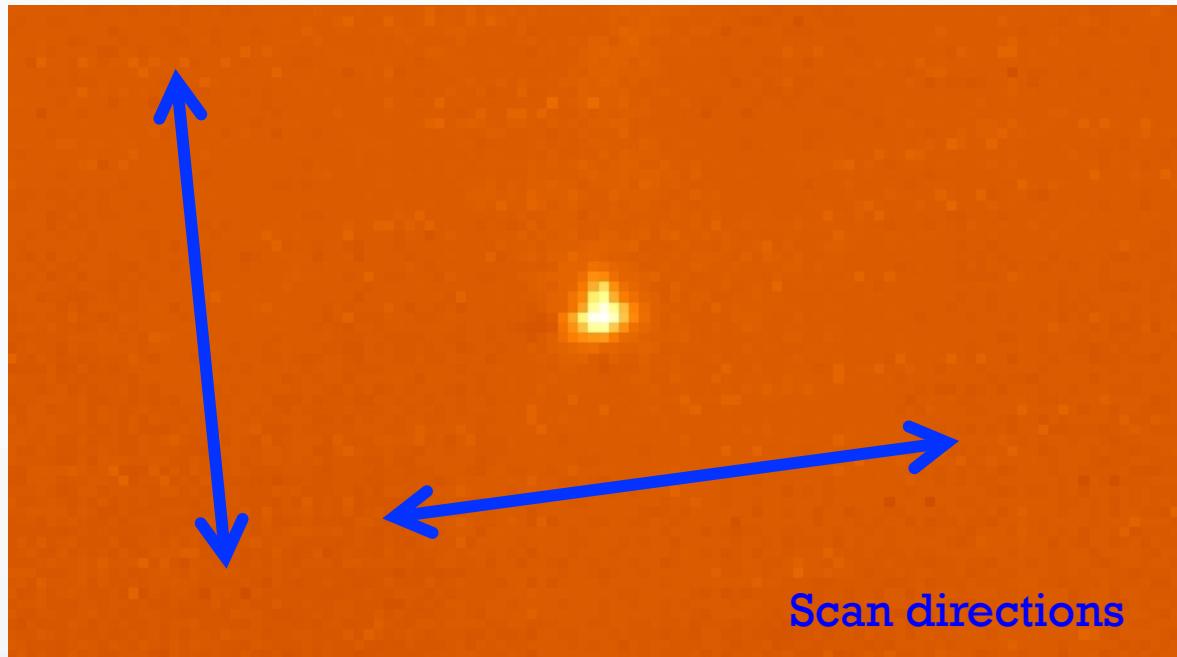


Box function in Fourier space:
RINGING!!!



Scan-speed

Beam is highly scan-direction dependent



Beam distortion breaks GLS assumption (pointing matrix P)

ROMAGAL PGLS

Cannot (?) be cured in a pre-process step

Solution: post-process artifacts analysis and removal PGLS/WGLS (MATLAB)
Piazzo et al. 2012

Post Processed GLS (PGLS) is based on the following artifacts estimation step

1. Unroll the GLS map:
2. Remove signal:
3. Remove correlated noise:
4. Estimate artifacts:

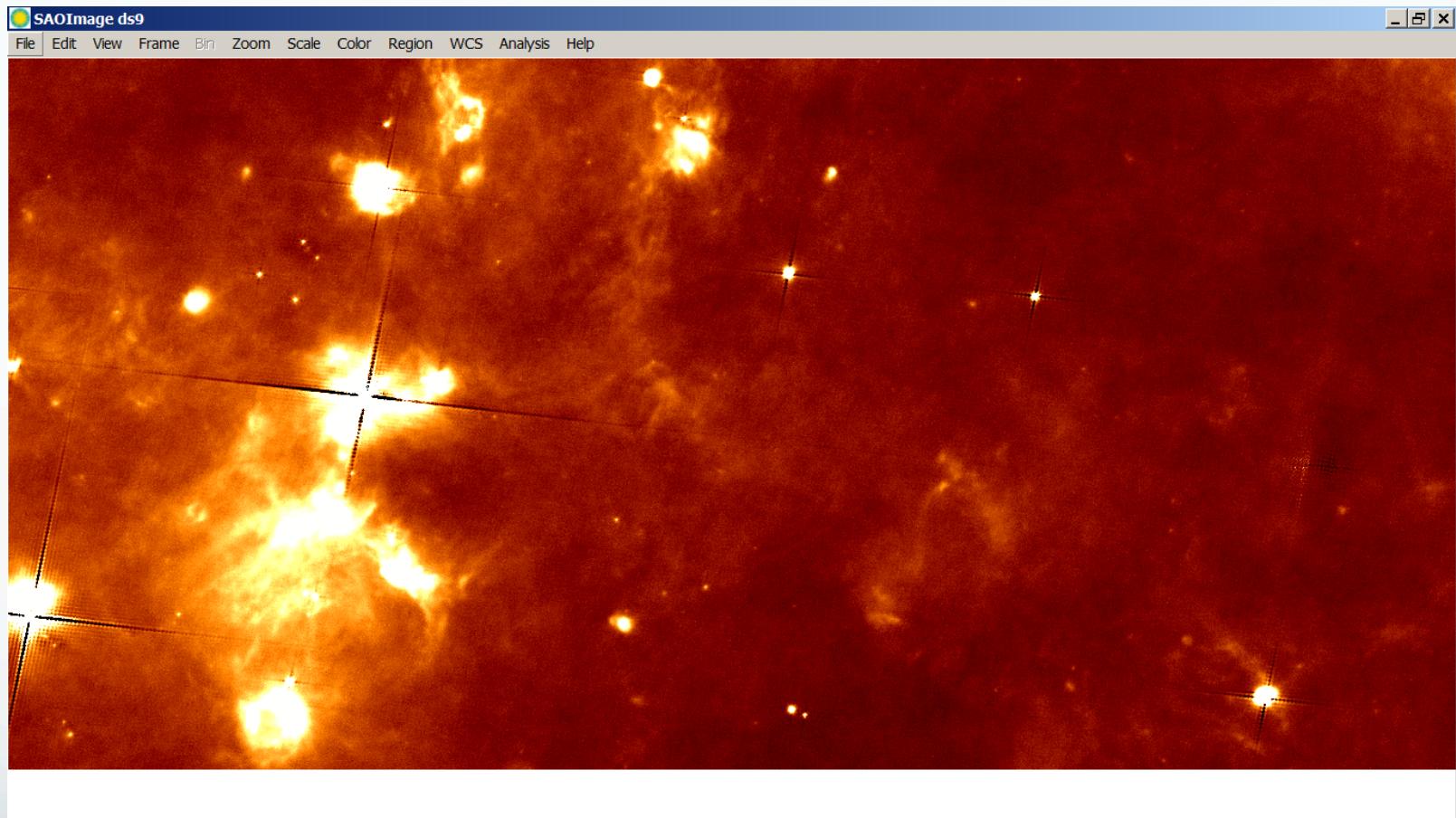
$$d_u = P^T \tilde{m}$$

$$d_n = d_u - d$$

$$d_w = M(d_n)$$

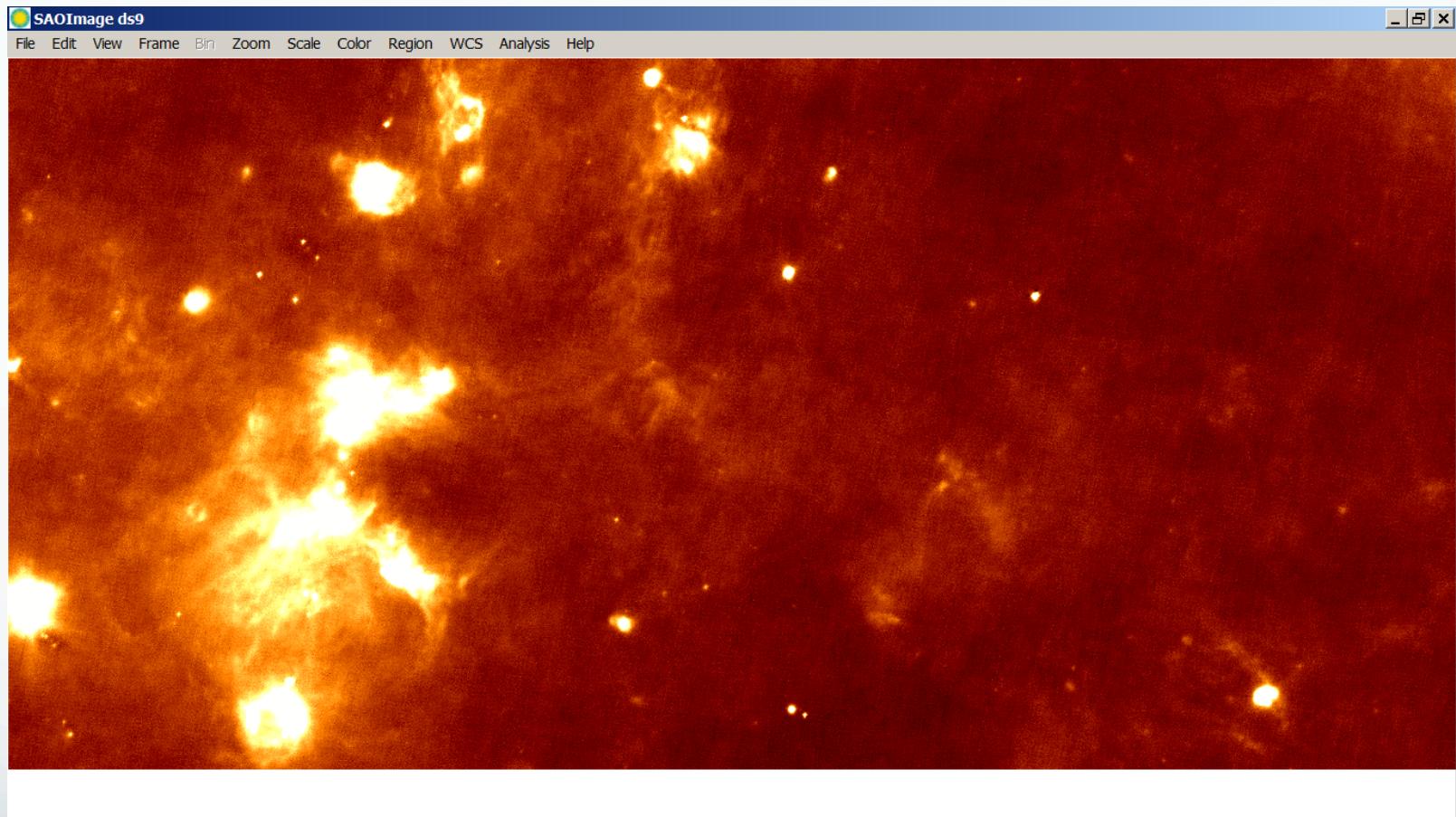
$$m_a = Pd_w$$

ROMAGAL PGLS



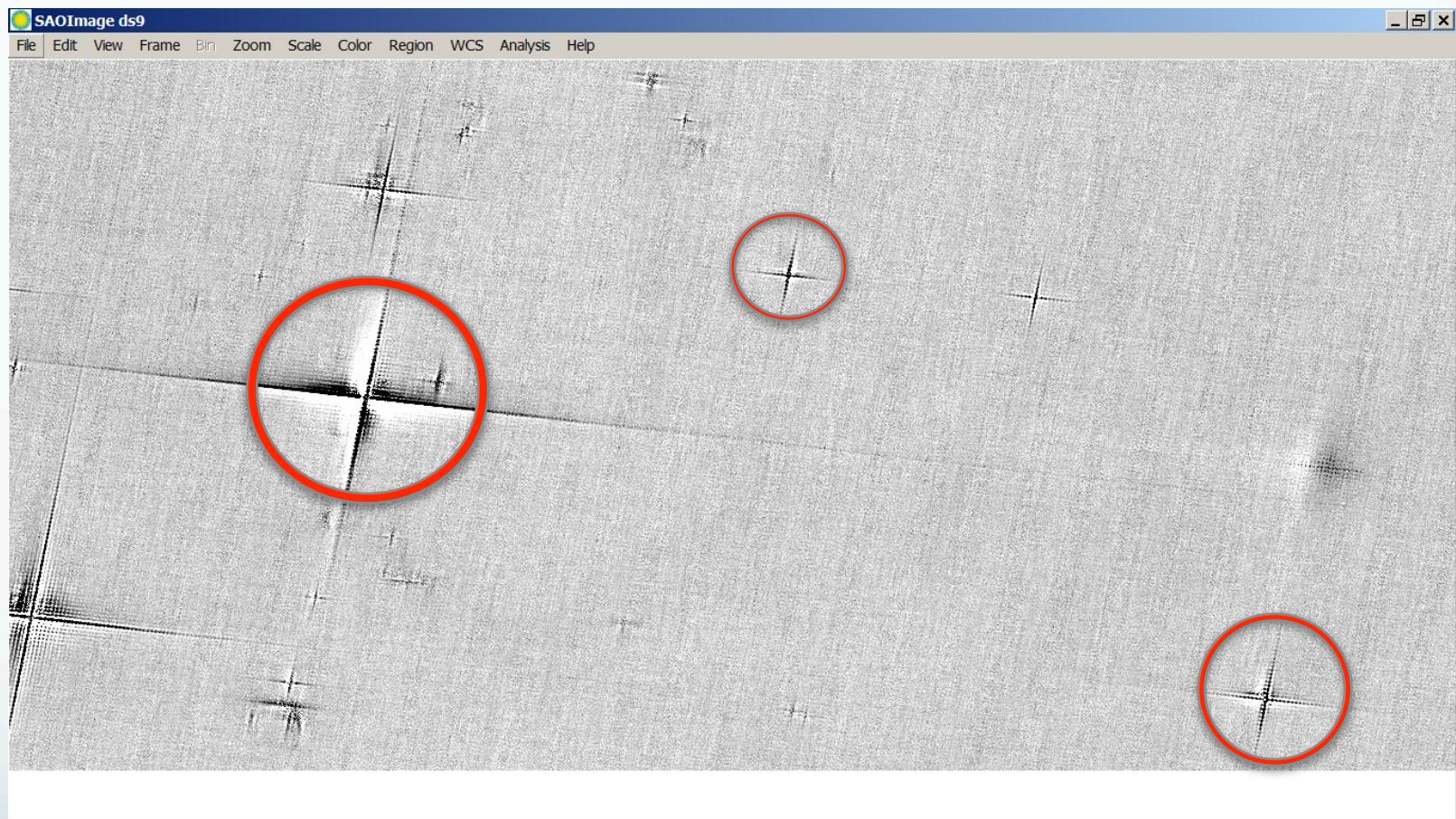
Hi-GAL 1323 PACS 70 μ m ROMAGAL

ROMAGAL PGLS



Hi-GAL 1323 PACS 70 μ m ROMAGAL PGLS

ROMAGAL PGLS – WGLS



Hi-GAL 1323 PACS $70 \mu m$ artifacts

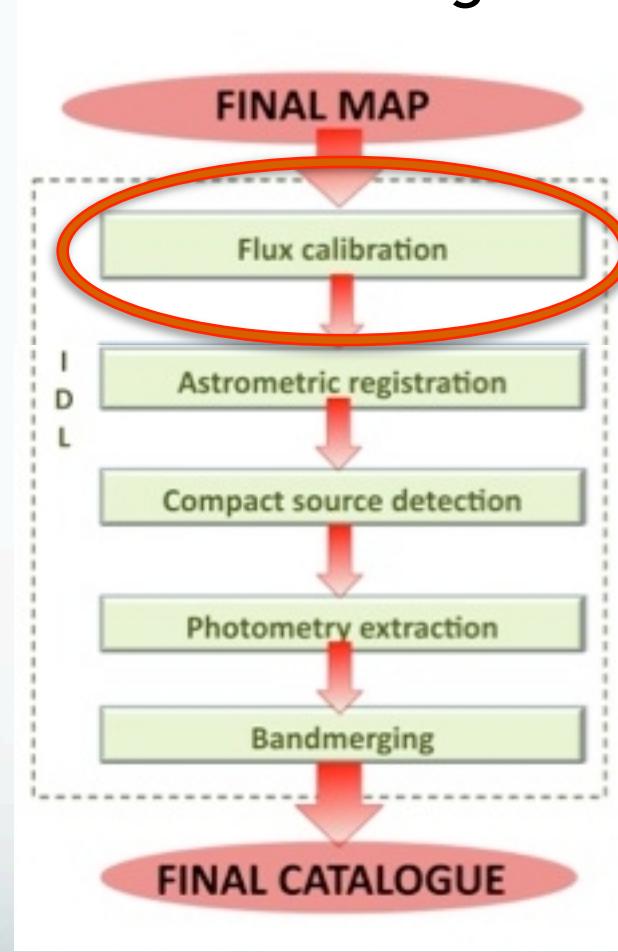
WGLS only adds noise where it is negligible (strong sources).

WGLS maps have the same SNR as GLS maps.

Credits: L. Piazzo

Map scientific product

Still several steps before releasing scientific product!!!

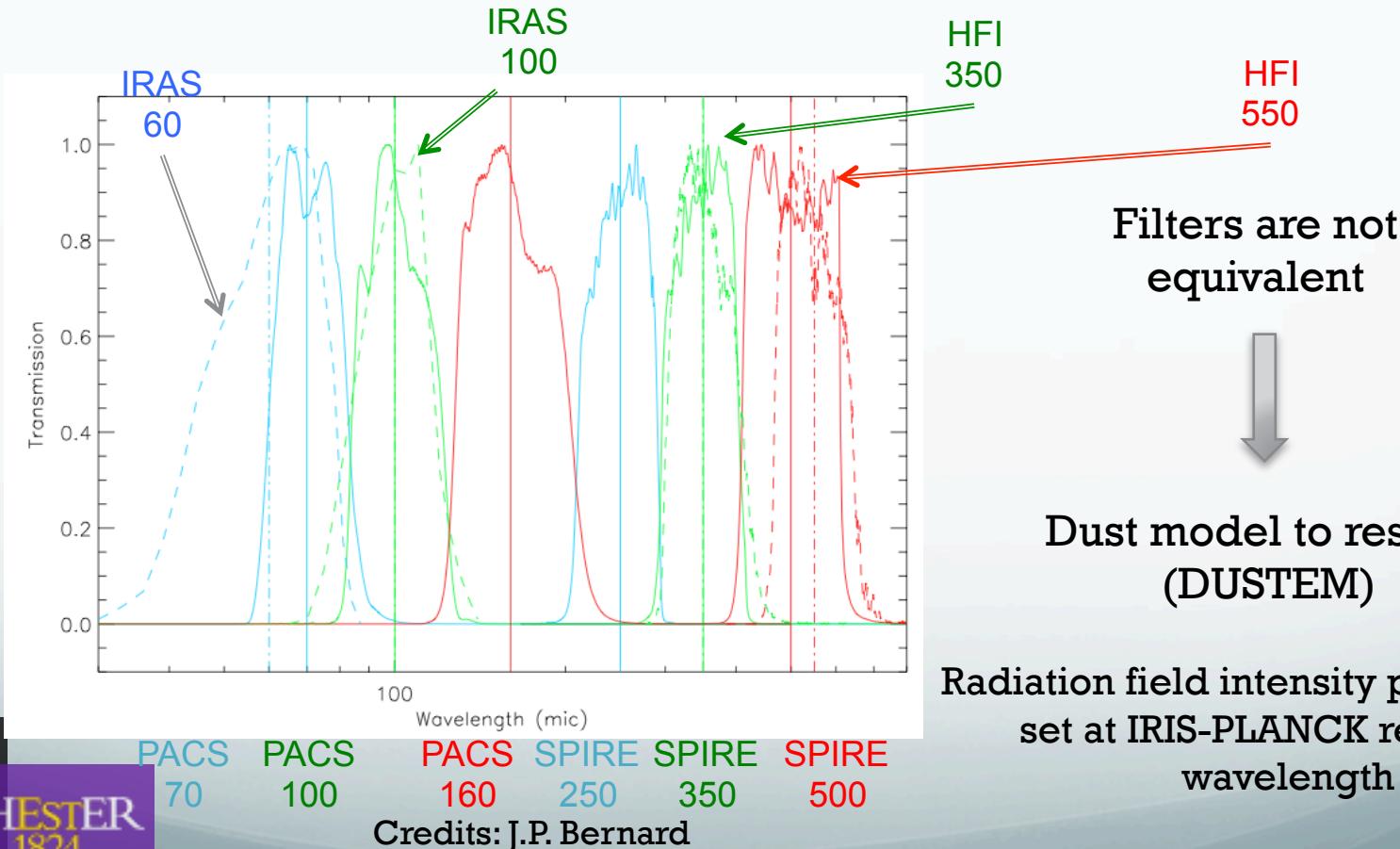


Map calibration

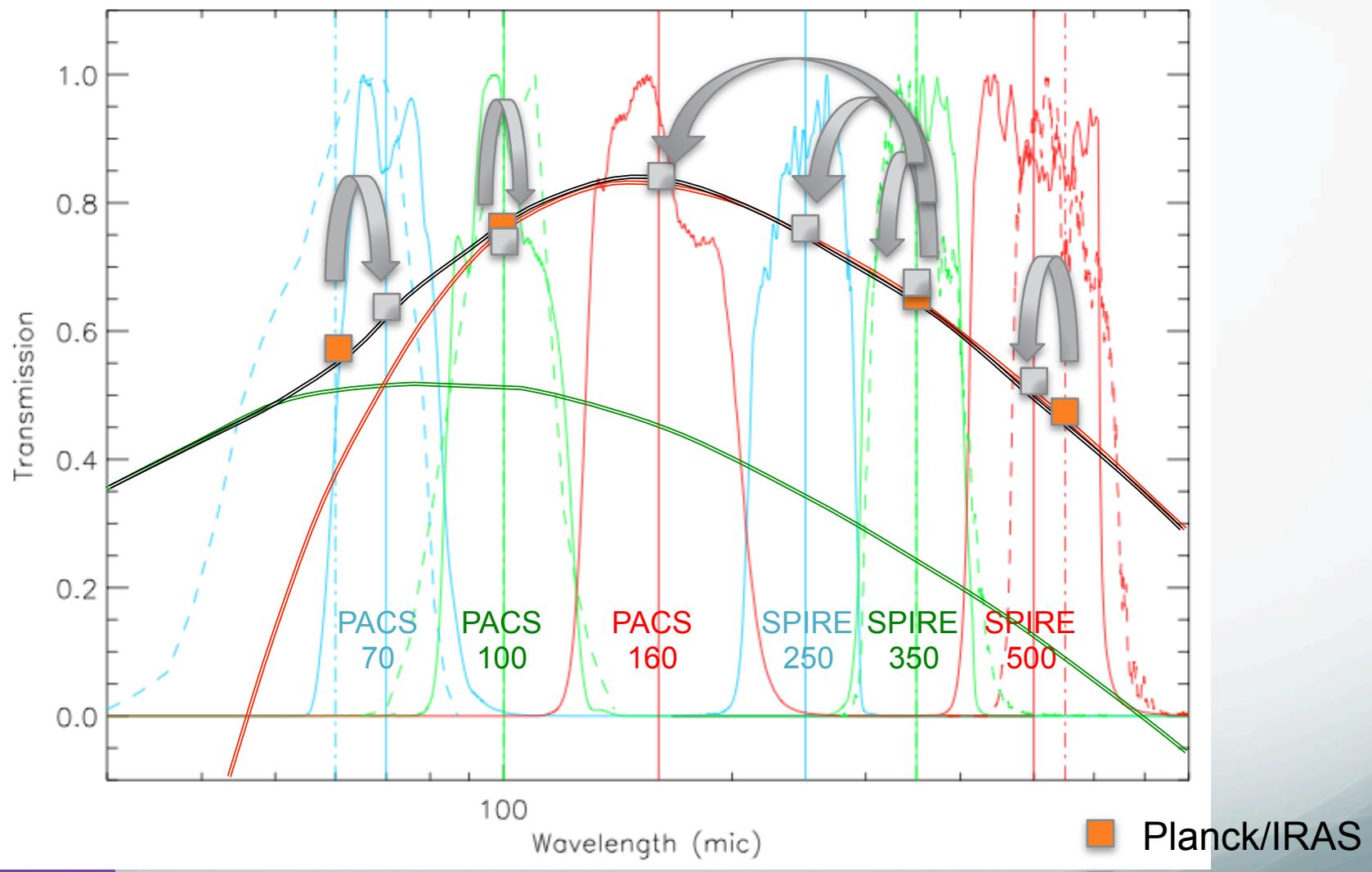
Zero-level offset evaluation: cross calibration with PLANCK and IRAS

Bernard et al. 2010

- Set from empty regions of the sky using IRAS
- Also 2 Herschel bands in common with PLANCK: 350 and 500 μ m



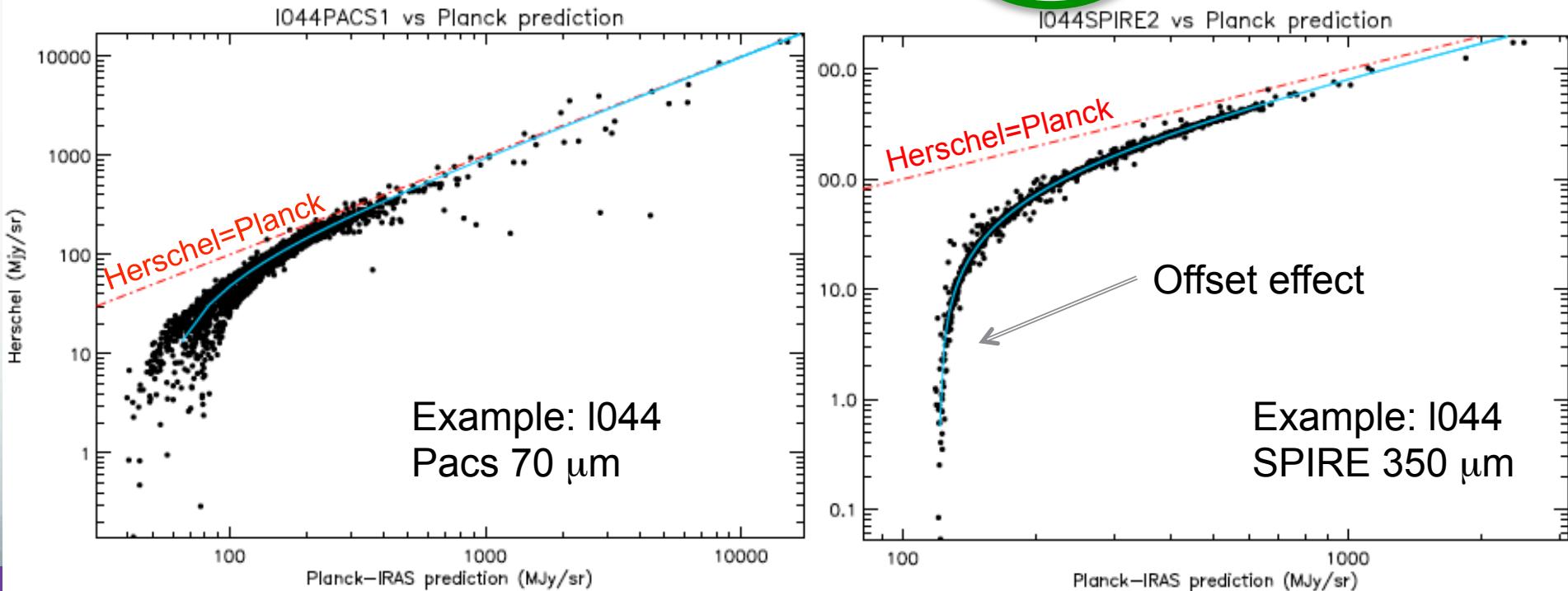
Map calibration



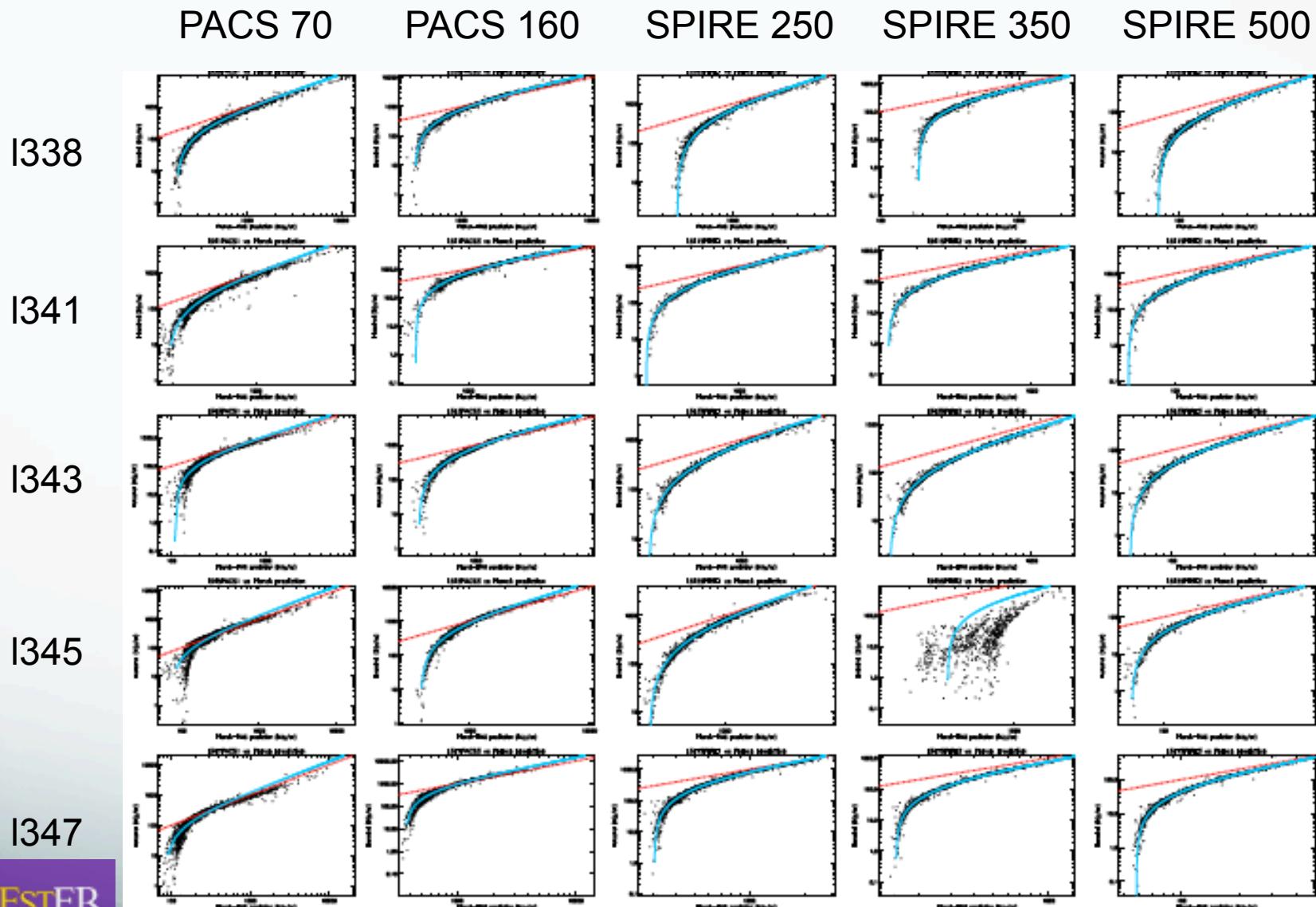
Map calibration

- Hi-GAL data I_{λ}^H smoothed at 5' (PLANCK resolution)
- Data correlated with PLANCK+IRIS prediction I_{λ}^m :

$$I_{\lambda}^m = I_{\lambda}^H \times scale + offset$$



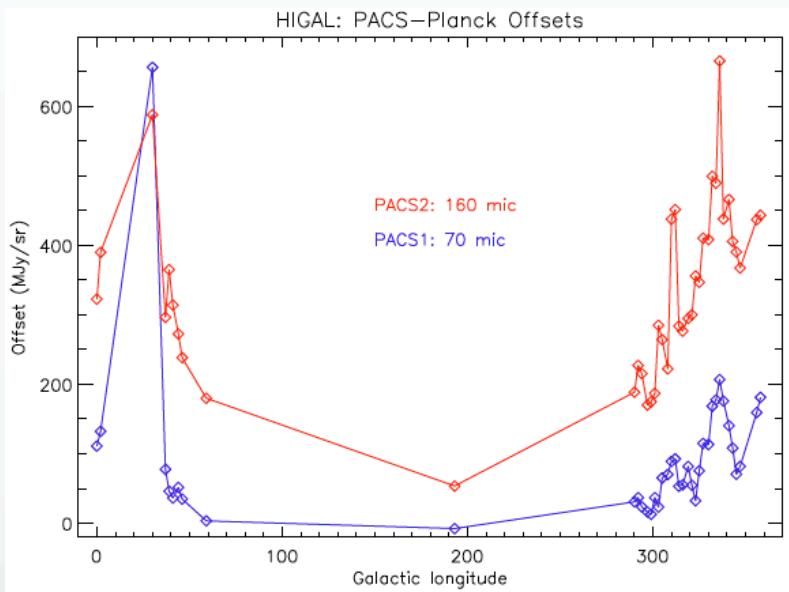
Map calibration



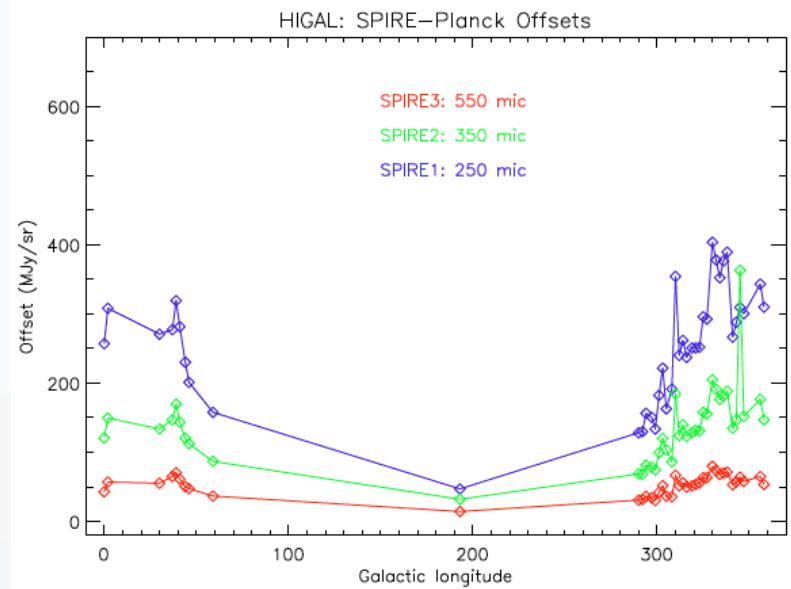
Credits: J.P. Bernard

Map calibration

PACS offsets



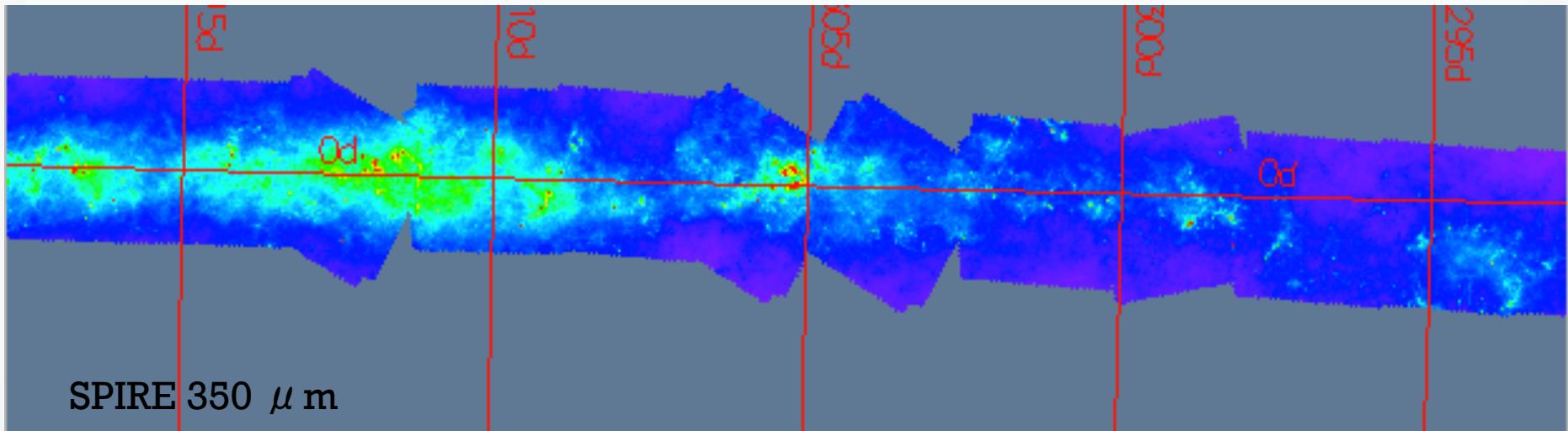
SPIRE offsets



Offsets follow the Galactic Structure

Credits: J.P. Bernard

Map calibration



Credits: J.P. Bernard

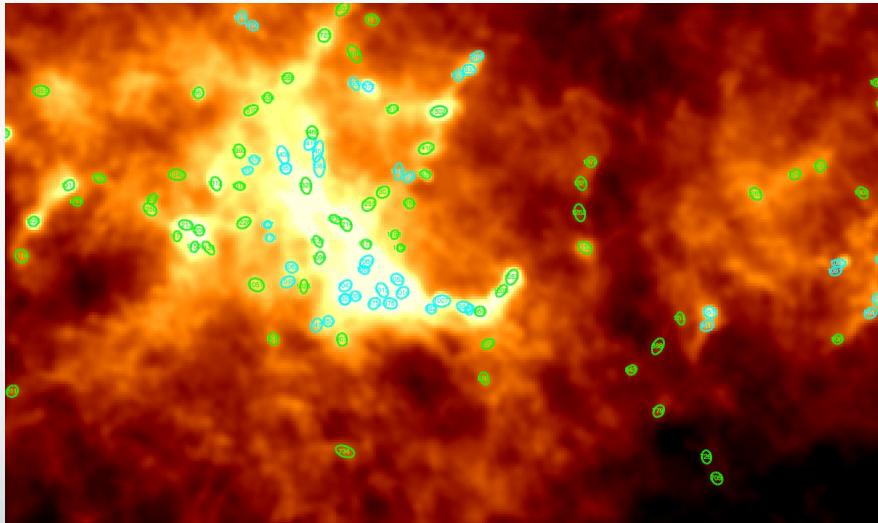
Brightness continuity between the tiles after zero-level calibration

Science

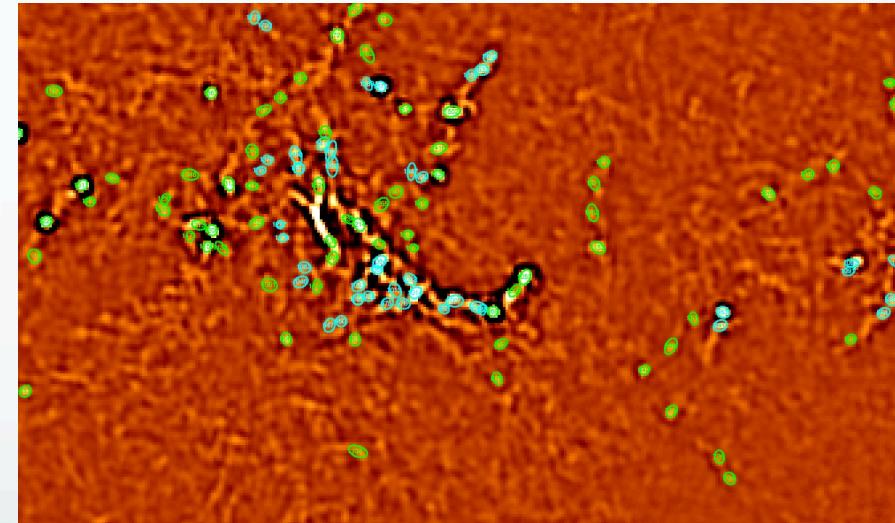
Source extraction and photometry: CUTEX

Molinari et al. 2010

- Curvature-based source detection
- Optimized for source de-blending
- Specifically designed to extract sources in crowded fields like Hi-GAL



Hi-GAL 70 μ m zoom



Second derivative

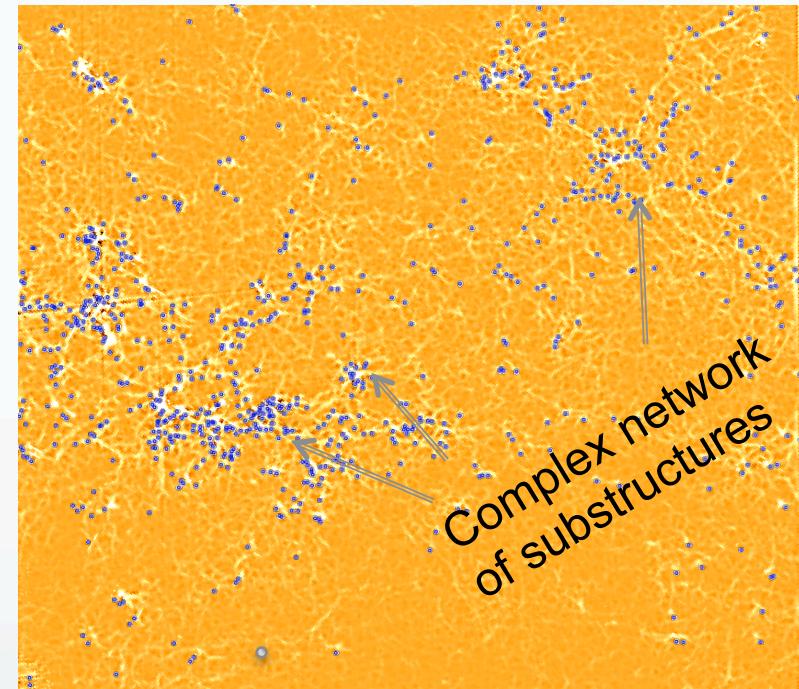
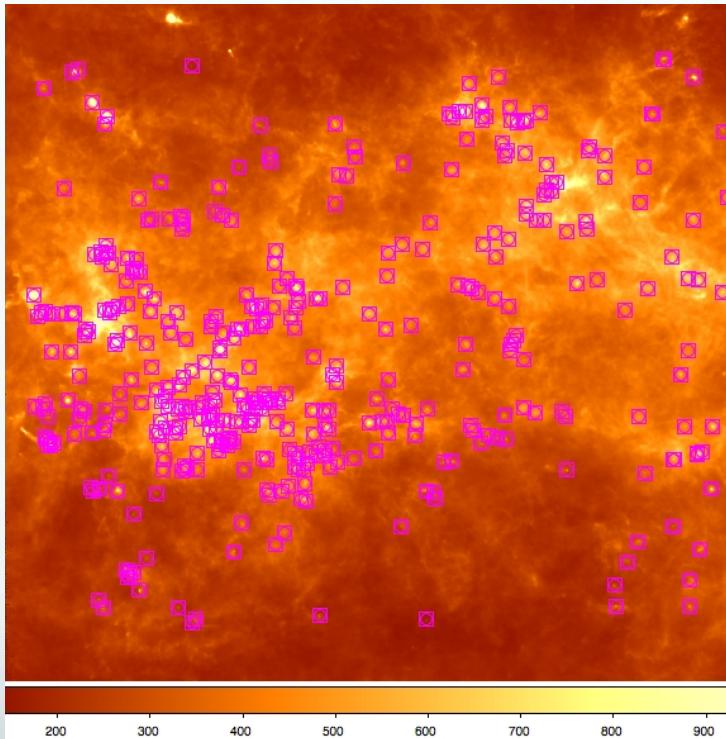
Preliminary catalogue in Hi-GAL “1” : ~ 400000 sources

Map: science

Source extraction and photometry: CUTEX

An example: **filaments**

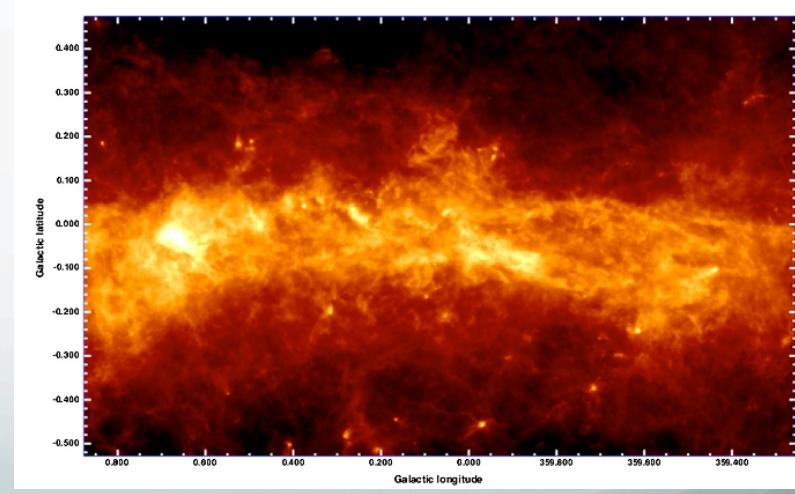
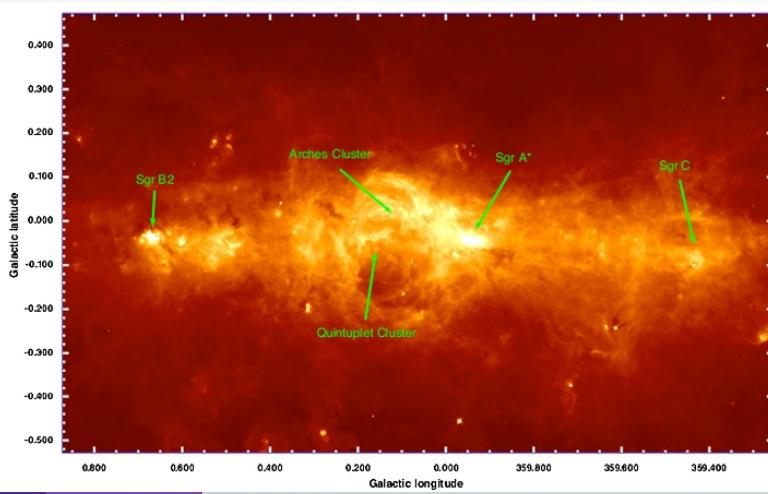
Molinari et al. 2010



Credits: E. Schisano

Map: science

- ROMAGAL maps calibrated and astrometrically registered (MIPS 24 μ m and/or WISE 22 μ m) available for Hi-GAL community
- ROMAGAL pipeline fully produced maps for Hi-GAL “1”
- 25+ works already published using ROMAGAL maps (e.g.: Galactic Center) Molinari et al. 2011

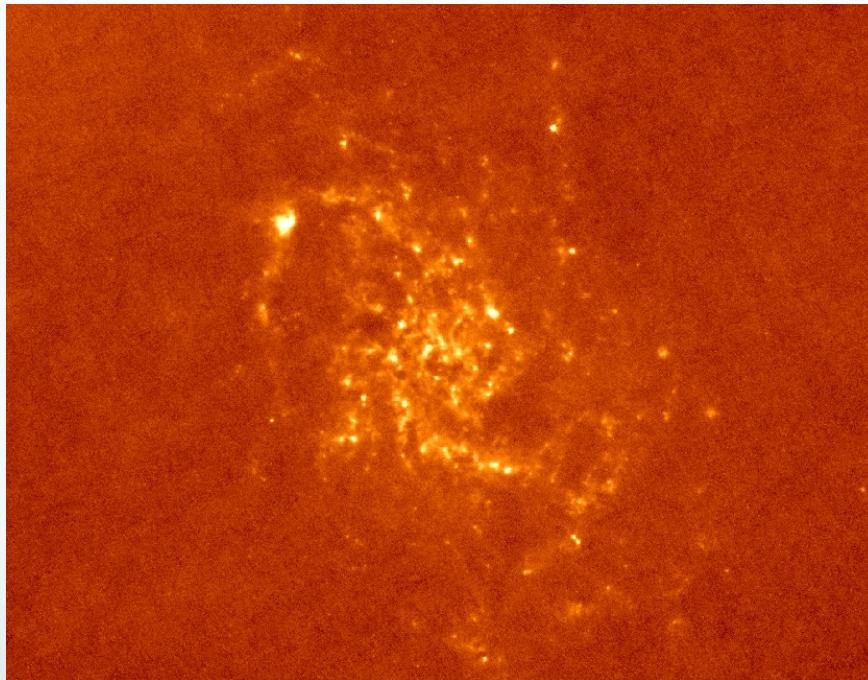


PACS 70 μ m

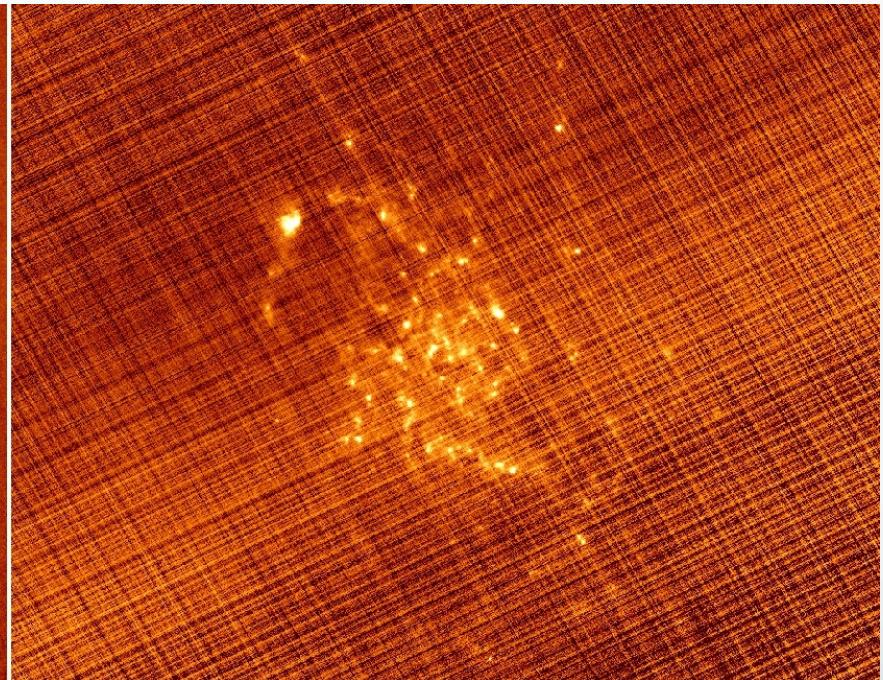
SPIRE 250 μ m

Map: science

...not only the Galactic Plane!



M33 PACS 70 μ m ROMAGAL



M33 PACS 70 μ m naïve

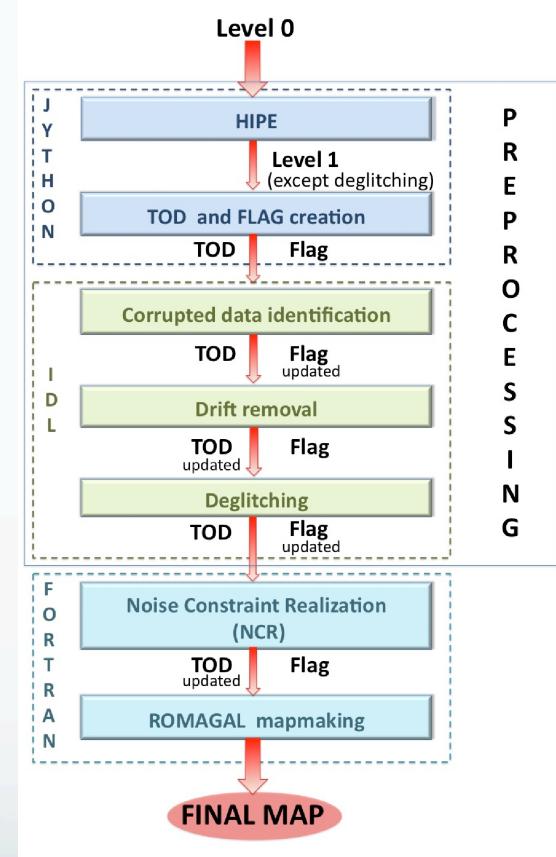
ROMAGAL?

For the whole Galactic Plane survey?

ROMAGAL pipeline requires:

- HIPE
- IDL
- Fortran90/95
- MATLAB

~ 6-7 h of processing per tile



Not really straightforward ...

UNIMAP

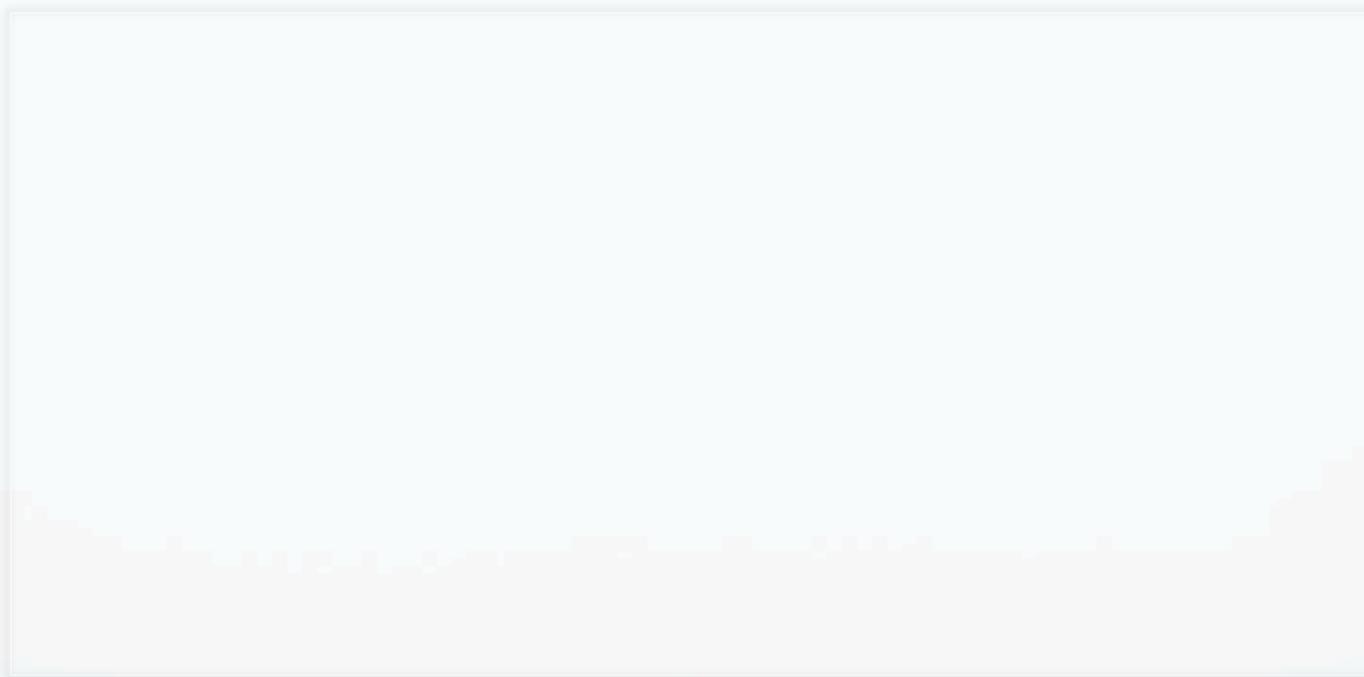
For the whole Galactic Plane survey?

ROMAGAL



UNIMAP

Thanks!!!



Alessio Traficante

Herschel map-making workshop 28-31/01/13

ROMAGAL

ROMAGAL (Roma Optimal Mapmaking Algorithm for HiGal survey) is the algorithm that implements this method, based on the ROMA code adapted and optimized for the HiGal contest

- ROMA already used for BOOMERanG 2003 (Masi et al. 2005)
- One of the main codes for PLANCK data analysis
- Parallel (MPI FORTRAN 95) code
- Direct estimation of noise from the data (see next talk)

MapMaking

We can model the time ordered data (TOD) \mathbf{d} as:

$$\mathbf{d} = \mathbf{Pm} + \mathbf{n}$$

Diagram illustrating the model $\mathbf{d} = \mathbf{Pm} + \mathbf{n}$:

- Pointing Matrix**: Represented by a blue arrow pointing from the left towards the term \mathbf{Pm} .
- Map to estimate**: Represented by a blue arrow pointing upwards towards the term \mathbf{Pm} .
- Noise**: Represented by a blue arrow pointing from the right towards the term \mathbf{n} .
- The term \mathbf{n} is circled in red.

Modelling the noise \mathbf{n} is the key to estimate \mathbf{m}

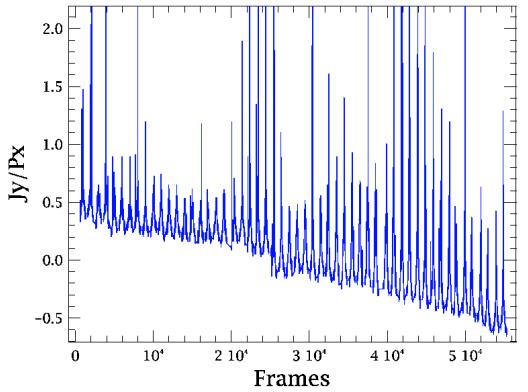
Noise:

- 1. Systematics
- 2. Glitches
- 3. White noise
- 4. Correlated noise

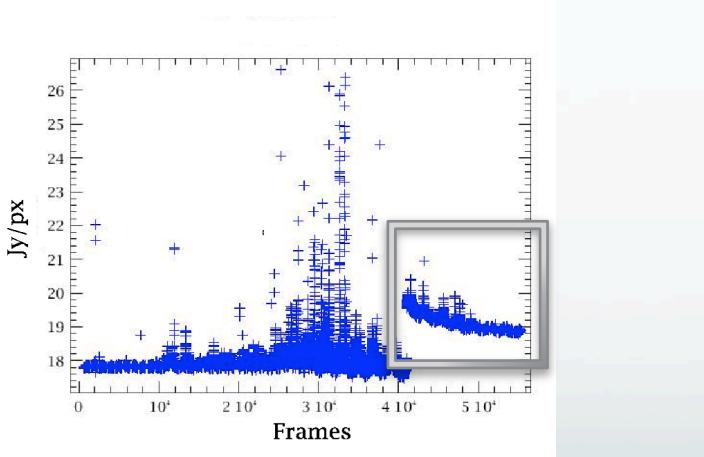
ROMAGAL
Pre-processing

ROMAGAL
algorithm

ROMAGAL preprocessing



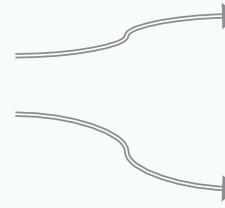
PACS 70μm TOD plot



TOD affected by powerful
glitch event: masked data

1. Drifts

- 1.1 telescope drift
- 1.2 electronic drift



Common to the entire array

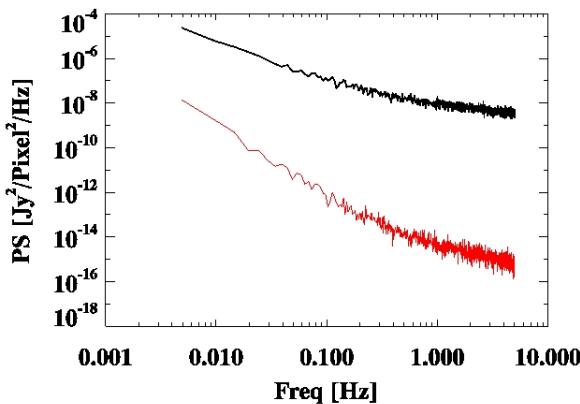
2. Bad data

- 2.1 glitches
- 2.2 saturations



Different for each sub-array

3. Noise Spectrum Estimation



PACS 70μm Power Spectrum

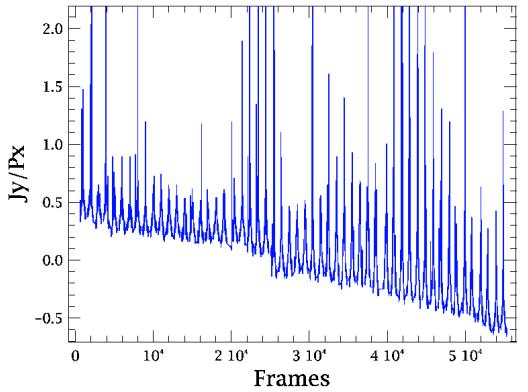
ROMAGAL

Carefully flagged data

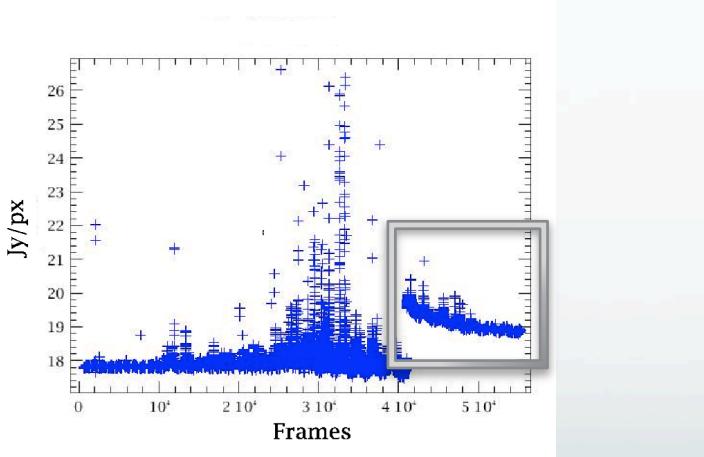
Blank data
(Thanks to G. Pilbratt)

- Auto spectrum
- Cross spectrum

ROMAGAL preprocessing



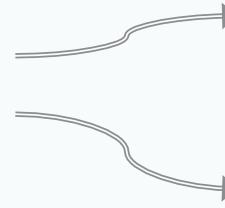
PACS 70μm TOD plot



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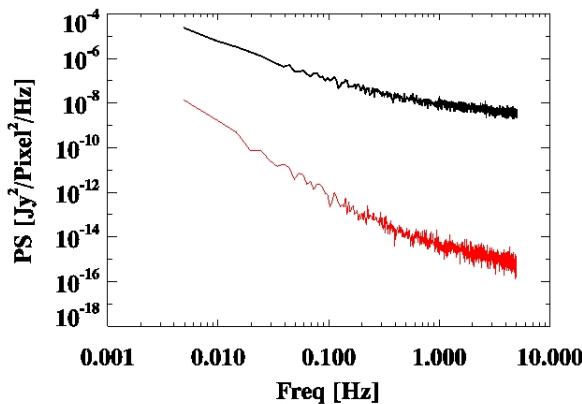
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PACS 70μm Power Spectrum

ROMAGAL

Carefully flagged data

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