# SWarp v2.16.3 User's guide

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#### 1 What is SWARP?

SWARP is a program that resamples and co-adds together FITS images using any arbitrary astrometric projection defined in the WCS standard<sup>1</sup>. The main features of SWARP are:

- FITS format (including multi-extensions) in input and output,
- Full handling of weight-maps in input and output,
- Ability to work with very large images (up to 500 Mpixels on 32-bit machines and 10<sup>6</sup> Tpixels with 64-bits), thanks to customized virtual-memory-mapping and buffering,
- Works with arrays in up to 9 dimensions (including or not two spherical coordinates),
- Selectable high-order interpolation method (up to 8-tap filters) in any dimension,
- Compatible with WCS and TNX (IRAF) astrometric descriptions,
- Support for equatorial, galactic and equatorial coordinate systems,
- Astrometric and photometric parameters are read from FITS headers or external ASCII files,
- Built-in background subtraction,
- Built-in noise-level measurement for automatic weighting,
- Automatic centering and sizing functions of the output field,
- Multi-threaded code with load-balancing to take advantage of multiple processors.
- XML VOTable-compliant output of meta-data.

# 2 Skeptical Sam's questions

Skeptical Sam doesn't have time to test software extensively but is always keen on asking agressive questions to the author to find out if a program could fit his needs.

**S.Sam:** What's the point in releasing another image co-addition software? We already had the *Drizzle* and *MSCRED* (IRAF) packages, for instance.

**Author:** Co-addition is most-certainly the most critical step in reducing modern CCD mosaic data. Although several powerful packages are already available, they did not meet all the requirements we have at the TERAPIX data center here in Paris.

S.Sam: SWARP doesn't perform the astrometric calibration, does it?

**Author:** No it doesn't. The astrometric calibration software of the TERAPIX pipeline will be released in future versions of the software. In the meanwhile, any polynomial description will do; you may use IRAF for instance.

**S.Sam:** I am the kind of guy who does high precision astrometry and photometry. My sources are detectable on raw frames. Resampling, you know, would just wreck the signal, so I prefer to combine measurements from individual images than to co-add pixels.

<sup>1</sup>see http://www.cv.nrao.edu/fits/documents/wcs/wcs.html

Author: It is true that resampling distorts slightly both signal and noise. However, if done properly, and if the data are not undersampled (Full Width at Half Maximum > 2.5 pixels), the degradation is generally very small. For instance, resampling a single ground-based image (atmospheric seeing of FWHM 3 pixels, and conversion factor  $2e^-/ADU$ ) twice with SWARP, and comparing fluxes and positions measured using PSF-fitting, one gets for bright stars rms differences of less than  $5.10^{-4}$  mag and  $10^{-3}$  pixel between the original and the twice-resampled images. This is already much better than what photon-noise allows for. Hence apart from situations of strongly non-stationary noise or undersampled data, the consequences of resampling are expected to be negligible.

# 3 Installing the software

#### 3.1 Software and hardware requirements

SWARP has been developed on Unix machines (Compaq Tru-64 and GNU/Linux), and should compile on any POSIX-compliant system. The software is run in (ANSI) text-mode from a shell. A window system is therefore unnecessary with present versions.

Memory requirements are fairly modest in most cases, as they do not depend on the size of the output images. 100MB is sufficient when co-adding images (even mosaics) involving current CCD chips  $(2k\times4.5k)$ . More memory may be helpful for co-adding bigger maps. Although the built-in virtual-memory feature will almost always allow one to work with any image size, the performance hit caused by file-swapping may be important in some cases.

#### 3.2 Obtaining SWARP

The easiest way to obtain SWARP is to download it from the official website<sup>2</sup>, or alternatively from the current official anonymous FTP site<sup>3</sup>. At this address can be found the latest versions of the program as standard .tar.gz Unix source archives, including the documentation, and Linux binaries as RPM packages. For production, it is strongly advised to install the RPM packages if you are running Linux on a machine with ix86 architecture and RPM-support, as they contain an optimized version of the code. The "-MP" (multi-processor) version can take advantage of multiple cores/processors in an SMP (or even hyperthreaded) configuration by running several threads at the same time.

#### 3.3 Installation

To install, you must first uncompress and unarchive the archive:

A new directory called swarp-x.x should now appear at the current position on your disk. You should then just enter the directory and follow the instructions in the file called "INSTALL".

The software is also available as a precompiled RPM for Linux systems with an x86 architecture. The multithreaded version (with the mp suffix in the filename) shall be installed preferably on machines with multiple processors, to take advantage of parallel processing. The simplest way to install an RPM package is to log as root and use the following command

<sup>2</sup>http://terapix.iap.fr/soft/swarp

<sup>3</sup>ftp://ftp.iap.fr/pub/from\_users/bertin/swarp/

# 4 Using SWARP

SWARP is run from the shell with the following syntax:

% swarp Input\_image1 [Input\_image2 ...] [@Image\_list1 [@Image\_list2 ...]] -c configuration-file [-Parameter1 Value1] [-Parameter2 Value2 ...]

The part enclosed within brackets is optional. The file names of input images can be directly provided in the command-line or in lists preceded with '@'. Lists are ASCII files containing the input file names (one per line). One should use lists instead of image file names if the number of input images is too large to be handled directly by the shell. Any "-Parameter Value" statement in the command-line overrides the corresponding definition in the configuration-file or any default value (see below).

#### 4.1 The Configuration file

Each time SWARP is run, it looks for a configuration file. If no configuration file is specified in the command-line, it is assumed to be called "default.swarp" and to reside in the current directory. If no configuration file is found, SWarp will use its own internal default configuration.

#### 4.1.1 Creating a configuration file

SWARP can generate an ASCII dump of its internal default configuration, using the "-d" option. By redirecting the standard output of SWARP to a file, one creates a configuration file that can easily be modified afterward:

% swarp -d >default.swarp

#### 4.1.2 Format of the configuration file

The format is ASCII. There must be only one parameter set per line, following the form:

Config-parameter Value(s)

Extra spaces or linefeeds are ignored. Comments must begin with a "#" and end with a linefeed. Values can be of different types: strings (can be enclosed between double quotes), floats, integers, keywords or boolean (Y/y or N/n). Some parameters accept zero or several values, which must then be separated by commas. Integers can be given as decimals, in octal form (preceded by digit 0), or in hexadecimal (preceded by 0x). The hexadecimal format is particularly convenient for writing multiplexed bit values such as binary masks. Environment variables, written as \$HOME or \${HOME} are expanded.

#### 4.1.3 Configuration parameter list

Here is a list of all the parameters known to SWARP. Please refer to next section for a detailed description of their meaning. Some "advanced" parameters (indicated with an asterisk) are also listed. They must be used with caution, and may be rescoped or removed without notice in future versions.

COPY_KEYWORDS	OBJECT	strings ( $n \le 1024$ )	Coma-separated list of FITS keywords that will be propagated from the input FITS headers to the coadded and re-
DELETE_TMPFILES	Υ	boolean	sampled image headers.  If true, resampled, temporary image files are deleted if COMBINE is set to Y.
FSCALASTRO_TYPE	FIXED	keyword	The way SWARP computes the astro-
		NONE FIXED	metric part of the flux-scaling:  - Ignore the effects of re-projection,  - Apply a fixed correction based on the ratio of pixel scales.
FSCALE_DEFAULT	1.0	floats $(n \le n_{\rm ima})$	Default fluxscale to adopt for each image if the FSCALE_KEYWORD keyword is not found in the FITS header.
FSCALE_KEYWORD	FLXSCALE	string	FITS keyword that should contain the flux scale in input images.
GAIN_DEFAULT	0.0	floats $(n \le n_{\text{ima}})$	Default gain (conversion factor in e <sup>-</sup> /ADU) to adopt for each image if the GAIN_KEYWORD keyword is not found in the FITS header. 0 means "infinite".
GAIN_KEYWORD	GAIN	string	FITS keyword that should contain the
HEADER_ONLY	Y	boolean	gain in input images.  If true, SWARP does not do anything but create the FITS header in the combined image. This header can later be duplicated as .head files to
HEADER_SUFFIX	.head	string	provide on several machines Extension of the external ASCII "headers" that shall be seeked to over- ride internal FITS parameters.
IMAGEOUT_NAME	coadd.fits	string	Name of the output image file.
IMAGE_SIZE	_	integers $(n \le n_{\text{dim}})$	Dimensions of the output image (in PIXELSCALE_TYPE MANUAL or FIT mode).
MEM_MAX	128	integer	Maximum amount of megabytes allowed for (silicon) memory storage.
NTHREADS	1 or 2 (MP)	integer	Number of threads (processes) to run simultaneously during the resampling phase. SWARP must have been compiled with the threads option enabled for this parameter to take effect.
OVERSAMPLING	0	integers $(n \le n_{\dim})$	Amount of oversampling in each dimension (0 means "automatic").
PIXEL_SCALE	_	floats $(n \le n_{\text{dim}})$	Step between pixels in each dimension (in PIXELSCALE_TYPE MANUAL mode). For angular coordinates, it must be expressed in arcseconds.

PIXELSCALE_TYPE	MEDIAN	keywords $(n \le n_{\text{dim}})$	The way SWARP sets the output pixel size:
		MEDIAN	– Take the median of pixel scales at
		MIN	the center of input frames,  - Take the minimum of pixel scales at the center of input frames,
		MAX	- Take the maximum of pixel scales at the center of input frames,
		MANUAL	- User-defined pixel scale at image center (with the PIXEL_SCALE keyword),
		FIT	- Compute the pixel scale in order to have the full output field fitting the user-defined IMAGE_SIZE.
PROJECTION_ERR	0.001	floats $(n \le n_{\rm ima})$	Maximum position error (in pixels) allowed for the bicubic-spline interpolation of the astrometric reprojection.  Use 0 for no interpolation.
PROJECTION_TYPE	TAN	string	Projection system used in output, in standard WCS notation (see Table 1).
RESAMPLE	Υ	boolean	If true, resampling is performed on the input images.
RESAMPLE_DIR		string	Path of the directory where resampled images are written.
RESAMPLE_SUFFIX	.resamp.fits	string	filename extension given to resampled images produced by SWARP.
RESAMPLING_TYPE	LANCZOS3	$\begin{array}{l} \textit{keywords} \; (n \leq n_{\mathrm{dim}}) \\ \text{NEAREST} \\ \text{BILINEAR} \\ \text{LANCZOS2} \\ \text{LANCZOS3} \\ \text{LANCZOS4} \end{array}$	Resampling method:  - Take the nearest neighbour,  - Bi-linear interpolation,  - Lanczos-2 4-tap filter,  - Lanczos-3 6-tap filter,  - Lanczos-4 8-tap filter.
SUBTRACT_BACK	Y	booleans $(n \le n_{\text{ima}})$	If true, input images are background- subtracted prior to resampling.
VMEM_DIR	/tmp	string	Path of the directory where virtual- memory and other temporary files are written.
VMEM_MAX	2048	integer	Maximum amount of megabytes allowed for virtual-memory storage.
WEIGHT_IMAGE WEIGHTOUT_NAME WEIGHT_THRESH*	coadd.fits	$strings (n \le n_{ima})$ string $floats (n \le n_{ima})$	List of input weight-maps. File name of the output weight-map. Threshold below or above which input weights are equivalent to zero (infinite variance, i.e. a bad pixel).
WEIGHT_TYPE	NONE	$\begin{array}{l} \textit{keywords} \; (n \leq n_{\mathrm{ima}}) \\ \text{NONE} \\ \text{MAP\_WEIGHT} \\ \\ \text{MAP\_VARIANCE} \end{array}$	Type of input weight-maps:  - no weighting,  - relative weights (i.e. inverse variance),  - relative variance,
		MAP_RMS	– absolute standard deviation.

WRITE_FILEINFO	N	boolean	If true, extended information about input files is written in the header of the output FITS image.
VERBOSE_TYPE	NORMAL	keyword	How much SWARP comments its operations:
		QUIET	- run silently,
		NORMAL	- display warnings and limited info
		ו זווד	concerning the work in progress,
		FULL	- display more complete information.
WRITE_XML	Y	boolean	If true, meta-data will be written in
			XML-VOTable format.
XML_NAME	swarp.xml	string	File name for the XML VOTable out-
			put of SWARP. Use "STDOUT" for pip-
			ing to standard output.
XSL_NAME*	•	string	URL of an XSL style-sheet for the
			XML output of SWARP. This URL
			will appear in the href attribute of
			the style-sheet tag.

# 5 How SWARP works

#### 5.1 Overview of the software

What SWARP does is basically to read a set of input FITS images, resample and combine them, and finally save the resultant FITS image to disk. The work can be decomposed in several steps:

- 1. Input image headers are read and checked for content. If configured in fully automatic mode, SWARP will set the characteristics of the output frame based on this information.
- 2. Input images (and their weight-maps, if available) are read one-by-one. Background-maps are built, and subtracted from the images if required.
- 3. Images are resampled, projected into subsections of the output frame, and saved as FITS files. "Projected" weight-maps are created too, even if no weight-maps were given in input.
- 4. A combined output image is created using the information stored in the "projected" weightmaps. It consists of a composite of the resampled sub-sections. A composite output weight-map is also written in the process.

The global layout of SWARP is presented in Fig. 1. Let us now describe each of the important steps.

#### 5.2 Image mapping and memory constraints

How does SWARP projects input images into the output frame space? There are two ways of applying a geometric transformation to an image (see Wolberg 1992). The most intuitive is called "forward mapping". It consists in scanning the input image pixel-per-pixel, line-by-line. Each pixel is simply "thrown" to the position it is supposed to occupy in the output grid. Although this technique can be used for geometric resampling or "drizzling" (Fruchter & Hook 1997), it is totally cumbersome with high order interpolation techniques. "Inverse mapping"

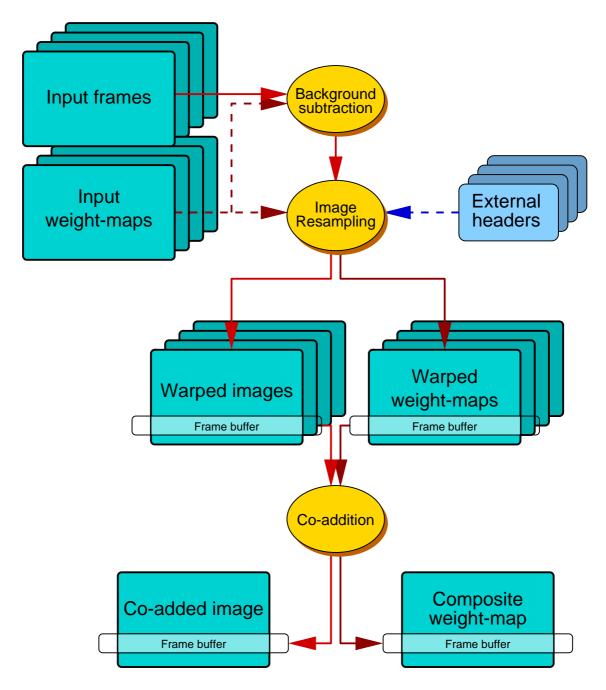


Figure 1: Global Layout of SWARP.

is far more efficient in this case. In this procedure the output frame is scanned pixel-per-pixel and line-by-line. Using the inverse projection, each output pixel center is associated a position in the input frame, at which the image is interpolated. This technique has been implemented in SWARP (Fig. 2); it possesses several advantages. The output image is accessed sequentially, and thus can be arbitrarily large. Also, only positions corresponding to pixels (or sub-pixels) within the output frame have to be mapped.

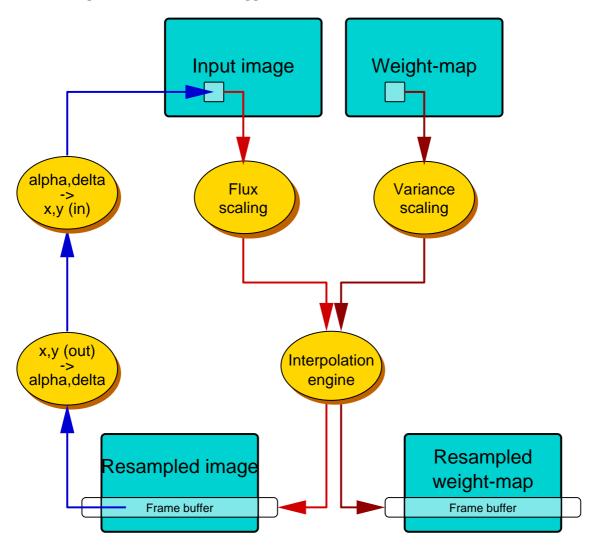


Figure 2: Layout of the image mapping section.

The most potentially critical part is the pseudo-random access in the input image. In most cases, it will be an individual imaging array (like an individual CCD) and will therefore fit in memory. For much larger input images however we rely on the efficiency of virtual-memory-mapping. SWarp's virtual memory engine works in the following way: each input image, stored as a single precision, 4-byte array is loaded in physical memory if the required amount of megabytes doesn't exceed MEM\_MAX. If it does, a temporary file called <code>vmxxxxx\_xxxxx.tmp</code> is written in the directory specified by VMEM\_DIRECTORY. The program exits with an error message if this file would exceed VMEM\_MAX Megabytes. The 3 "memory" parameters are mostly hardware-dependent. It is advised to set MEM\_MAX to 50-100% of the actual amount of memory present in your machine. If disk-space is not the limiting factor, VMEM\_MAX should be set to a higher value, 2048 on a 32-bit machine, or even more on a 64-bit machine. The choice of the VMEM\_DIRECTORY is critical. First, this write-enabled directory must be large enough to contain each input image in floating-point

format. Second, it is strongly recommended to have the data on a fast disk. Note that the default path for VMEM\_DIRECTORY is /tmp, which on many systems is on a partition simply not large enough to handle the typical quantities of data to process. An alternative is to use ".", the current directory, at the expense of disk thrashing!

De-projecting and co-adding simultaneously all input images would frequently imply many files open at the same time, and large amounts of (virtual) memory. SWARP takes a more sequential approach: each input image is mapped in a tightly-fitting rectangular subsection of the output frame. All subsections are written to disk (in the RESAMPLE\_DIRECTORY) as *swarp.xxx.fits* FITS files, and read back later during the co-addition phase, to be stacked together. Individual subsection files are automatically removed after processing or abortion. It is possible to disable the deletion by setting the DELETE\_TMPFILES configuration parameter to N (the default is Y). This can be useful for diagnostic purposes.

Note that although SWARP does not use much memory, the amount of temporary disk-space needed during processing can be quite large. In addition to the output image and weight-map, one should provide disk-space for the individual projected images and their weight-maps. In the case of mappings done at unit scale, this involves storing more than twice the amount of input pixels as temporary data.

#### 5.3 Propagating FITS keywords

During the re-gridding and co-addition processes involved in SWARP, the FITS keywords present in the input image headers are not automatically copied to the output image headers (many of them become irrelevant). Nevertheless, for data management purposes it is often useful to propagate some selected FITS keywords (such as FILTER, EXPTIME or TELESCOP for instance) and their values from the input image headers to the resampled and coadded image headers. To this aim, a COPY\_KEYWORDS configuration parameter is provided. It accepts a list of FITS keywords that shall be copied in the headers of all the images created by SWarp (by default, only the OBJECT keyword and its content are copied). But because the coadded image can result from the combination of many input files, only the keyword found in the first image header from the input file list is propagated up to the final coadded image. It is important to note that SWARP does not check the content of the list of COPY\_KEYWORDS; therefore one should be cautious not to propagate FITS keywords like NAXIS1,BITPIX,... that may interfere with the interpretation of the output data.

#### 5.4 Parallel processing

Versions  $\geq 1.32$  of SWARP can be compiled with "multi-threading" enabled<sup>4</sup>. Multi-threading allows CPU-intensive tasks in SWARP to be run in parallel on Symetric Multi-Processing (SMP) or Hyper-Threaded (HT) machines. By default, SWARP-MP uses 2 computing threads, which should lead to a  $\approx 1.85 \times$  speed-up in resampling compared to the mono-threaded version, on an SMP machine. The number of computing threads used can be set with the NTHREADS configuration parameter. Best performance is generally achieved with NTHREADS equal to the number of processors in the machine<sup>5</sup>. Figure 3 shows the improvement in SWARP pixel throughput as a function of NTHREADS on a 4-processor machine. Departure from a linear scaling with the number

<sup>&</sup>lt;sup>4</sup>To check if your SWARP executable is multi-threaded, run it without any argument. Multi-threading is enabled if the displayed version number is followed by "-MP".

<sup>&</sup>lt;sup>5</sup>The actual number of threads started by SWARP is always larger than NTHREADS; but no more than NTHREADS threads are active simultaneously.

of threads are mostly due to I/O limitations and parts of code that are not multithreaded.

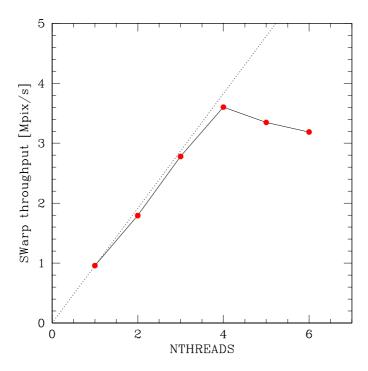


Figure 3: Pixel throughput of SWARP 2.0 resampling (Lanczos3) as a function of the NTHREADS configuration parameter on an SMP machine with 4 Opteron-242 (1.6GHz) processors. Perfect linear scaling is indicated by the dashed line for reference.

#### 5.5 Astrometry

The astrometric engine at the heart of SWARP is based on M. Calabretta's WCSlib library<sup>6</sup>, to which we added the handling of polynomial distorsion parameters (FITS keywords PV\_xx\_xx) as proposed in the latest WCS documents<sup>7</sup>. We included IRAF's TNX astrometric projection too (for inputs only), although it is not part of the WCS standard.

All celestial coordinate computations are performed in the equatorial system. Galactic or ecliptic coordinates are supported in input and output.

#### 5.5.1 Input frames

(De-)projection parameters of input images are extracted from their respective FITS headers. These are the usual CTYPEx CRVALx, CRPIXx, CDELTx and/or CD\_xx\_xx WCS parameters. External "header" files can also be provided by the user; for every input xxxx.fits image, SWARP looks for a xxxx.head header file, and loads it if present. A .head suffix is the default; it can be changed using the HEADER\_SUFFIX configuration parameter. External headers may either be real FITS header cards (no carriage-return), or ASCII files containing lines in FITS-like format, with the final line starting with "END\_LILILILI". Multiple extensions in ASCII files must be separated by an

<sup>&</sup>lt;sup>6</sup>Available at http://www.cv.nrao.edu/fits/src/wcs/

<sup>&</sup>lt;sup>7</sup>http://www.cv.nrao.edu/fits/documents/wcs/wcs.html

"END\_ULLUL" line; there should not be any primary header in that case. External "headers" need not contain all the FITS keywords normally required. The keywords present in external headers are only there to override their counterparts in the original image headers, or add new ones.

#### 5.5.2 Output frames

The celestial pair of components of the output coordinate system is specified with the CELESTIAL\_TYPE configuration parameter, and can be selected among NATIVE, PIXEL, EQUATORIAL, GALACTIC and ECLIPTIC. In NATIVE mode, the output celestial coordinate system is taken from that of the *first* file of the input list. This is the default. The PIXEL option forces SWARP to ignore all the "celestial" aspects (projection, de-projection, sky coordinates) of both input and output images. It provides a major speed-up to the warping engine by bypassing all the trigonometric operations normally involved in the other modes. It is useful for quickly combining mosaic images whenever astrometric information is not needed. In PIXEL mode, degrees are interpreted as dimensionless Cartesian coordinates.

The output (celestial) projection is set by the PROJECTION\_TYPE configuration parameter. The list of all presently supported projections is shown in Table 1, and illustrated in Fig. 4 and 5 using a gridded map of the Earth.

Now, what projection is the best? With "small" fields (< 10 degrees in their maximum dimension), the choice is not critical as long as the projection center lies within the frame. For compatibility reasons, it is advised to stay with the traditional gnomonic (TAN, for tangential) projection in such cases. With larger fields the pure tangential projection is inappropriate, and one is faced with the usual problems confronted by cartographers. It would be outside the scope of this document to discuss the merits of each projection. For detailed information about the different projection systems, the user should refer to the latest WCS document. Let us just mention that equal-area projections (those that conserve relative areas) are often to be preferred for mapping large sky surveys, because they naturally conserve surface-brightness and/or allow summing pixel values to measure fluxes. The following are equal-area projections: ZEA, CEA, COE, BON, GLS, PAR, MOL, AIT, QSC. AIT (Aitoff) is one of the most popular projections for all-sky maps.

Note that some of the projections (CYP, CEA, COD, COE, COO, COP and BON) require additional PV\_xx\_xx parameters. These parameters can easily be included in a xxxx.head header file with the same prefix as the output coadded image (which is coadd.fits by default, see the example at the end of this document).

Centering of the output frame is controlled by the CENTER\_TYPE parameter. There are three centering modes:

- ALL: the field is centered in a way that all input images fit into the output frame. This is the default.
- MOST: the field is centered on the zone of maximum overlap between input images.
- MANUAL: manual centering with the CENTER parameter.

A different centering mode can be used in each dimension; for instance, in 2D images with  $\alpha, \delta$  coordinates, "CENTER\_TYPE ALL,MOST" will apply the ALL mode in  $\alpha$  and the MOST mode in  $\delta$ . If a single mode is specified, it is applied to all available dimensions.

The CENTER parameters are active in CENTER\_TYPE MANUAL mode only, and must be used to specify the actual center of the output field, in world units. In the case of angular coordinates, both

Table 1: Valid PROJECTION\_TYPEs in SWARP

$Zenithal\ projections$	
AZP	Zenithal perspective
TAN	Distorted tangential
STG	Stereographic
SIN	Slant orthographic
ARC	Zenithal equidistant
ZPN	Zenithal polynomial
ZEA	Zenithal equal-area
AIR	Airy
Cylindrical projections	
СҮР	Cylindrical perspective
CEA	Cylindrical equal-area
CAR	Plate carrée
MER	Mercator
Conic projections	
COP	Conic perspective
COE	Conic equal-area
COD	Conic equidistant
C00	Conic orthomorphic
Pseudoconic and polyconic projections	
BON	Bonne's equal-area
PCO	Polyconic
Pseudocylindrical projections	
GLS	Global sinusoidal (Sanson-Flamsteed)
PAR	Parabolic
MOL	Mollweide
AIT	Hammer-Aitoff
Quad-cube projections	
TSC	Tangential spherical cube
CSC	COBE quadrilateralized spherical cube
QSC	Quadrilateralized spherical cube
	=

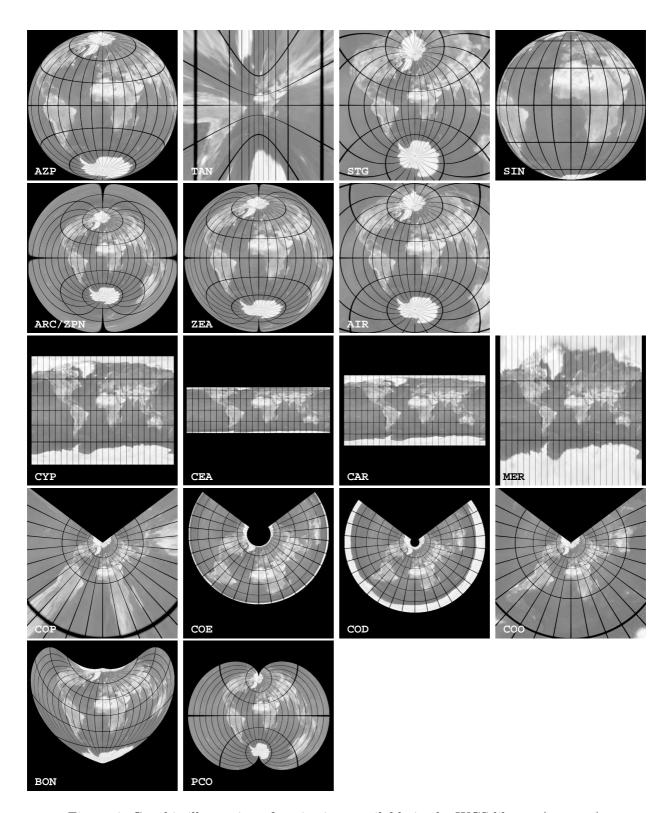


Figure 4: Graphic illustration of projections available in the WCS library (see text).

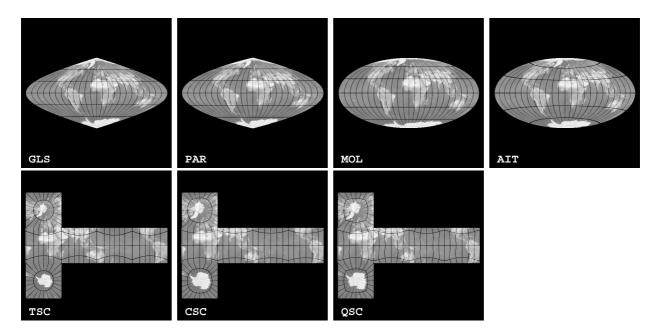


Figure 5: Graphic illustration of projections available in the WCS library (continued from Fig. 4).

the floating point (in degrees) and sexagedecimal formats are accepted: right ascension/longitude may be written as hh:mm:ss.ss, and declination/latitude as  $\pm dd:mm:ss.ss$ .

The pixel "scale" (which is the step between pixels at the center of the output frame) can be computed automatically in each dimension by SWARP. There are five modes specified by the PIXELSCALE\_TYPE configuration parameter:

- MEDIAN (the default): the median value of all pixel scales at the center of input frames is taken as the output pixel scale.
- MIN: the smallest of all pixel scales at the center of input frames is taken.
- MAX: the largest of all pixel scales at the center of input frames is taken.
- MANUAL: manual scaling with the PIXEL\_SCALE configuration parameter.
- FIT: Pixel scales are automatically computed to have the projected data fitting the output frame dimensions specified with the IMAGE\_SIZE configuration parameter.

When right ascension/longitude and declination/latitude are both present, pixel scales computed by SWARP are made equal in both dimensions to avoid anamorphosis.

The PIXEL\_SCALE parameters are active in PIXELSCALE\_TYPE MANUAL mode only, and must be used to specify the actual pixel step for each dimension, in world units. Note that in the case of angular coordinates, PIXEL\_SCALE values are read in arcseconds, not degrees.

The dimensions of the output frame (in number of pixels per axis) are set using the IMAGE\_SIZE configuration parameter. A value of 0 for any axis results in an automatic dimensioning of this axis; but obviously this is not possible in PIXELSCALE\_TYPE FIT mode.

Note that the current simple algorithms used for automatic centering and scaling routines can get confused rather easily close to the pole or with some very wide field projections. In particular, it is recommended to turn off automatic settings when making all-sky projections.

#### 5.5.3 Bi-cubic spline interpolation

The trigonometric calculations involved in SWARP re-projections have a major impact on processing speed. To accelerate the resampling phase, versions  $\geq 2.06$  of SWARP implement a bicubic spline interpolation<sup>8</sup> of the astrometric mapping between the input and the output frames. Interpolation is used by default for large images, with a maximum allowed positional error of  $10^{-3}$  pixel (as measured in the output frame). This error tolerance can be changed independently for each input image with the PROJECTION\_ERR configuration parameter. A PROJECTION\_ERR of 0 turns interpolation off. Interpolation is also automatically deactivated for smaller images or inappropriate mappings like all-sky projections or projection with singularities.

#### 5.6 Resampling

The action of projecting a grid of pixels on another grid is called resampling. Ideal image resampling involves both filtering and interpolation between pixels. In SWARP, filtering is "naturally" implemented by oversampling the destination grid. Because SWARP uses reverse-mapping, interpolation is made on the input images.

#### 5.6.1 Image data

At each position  $\mathbf{x}$ , the dot-product between a local kernel  $\mathbf{k}(\mathbf{x})$  and neighbouring pixel values  $\mathbf{f}$  yields a local, interpolated value:

$$\tilde{f}(\mathbf{x}) = \mathbf{k}(\mathbf{x}).\mathbf{f} \tag{1}$$

The kernel is derived locally from an *interpolation function h*:

$$k_i(\mathbf{x}) = h(\mathbf{x} - \mathbf{x}_i) \tag{2}$$

The RESAMPLING\_TYPE configuration parameter allows the user to choose among several symmetric, compact interpolation functions:

- NEAREST: a "square box" response function, with width 1 pixel. Applying this function produces nearest-neighbour interpolation (also known as sample-and-hold). The kernel extends over a single input pixel.
- BILINEAR: a pyramidal response function with Full-Width at Half Maximum 1 pixel. This results in a bilinear interpolation. The kernel extends over  $2^{n_{\text{dim}}}$  pixels.
- LANCZOS2: a  $\prod_d \operatorname{sinc}(\pi x_d) \operatorname{sinc}(\frac{\pi}{2} x_d)$  response function with  $(-2 < x_d \le 2)$  (Lanczos2 window). The kernel extends over  $4^{n_{\text{dim}}}$  pixels.
- LANCZOS3: a  $\prod_d \operatorname{sinc}(\pi x_d) \operatorname{sinc}(\frac{\pi}{3} x_d)$  response function with  $(-3 < x_d \le 3)$  (Lanczos3 window). The kernel extends over  $6^{n_{\text{dim}}}$  pixels.
- LANCZOS4: a  $\prod_d \operatorname{sinc}(\pi x_d) \operatorname{sinc}(\frac{\pi}{4} x_d)$  response function with  $(-4 < x_d \le 4)$  (Lanczos4 window). The kernel extends over  $8^{n_{\text{dim}}}$  pixels.

As demonstrated in Fig. 6, the Lanczos4 interpolation function provides the best resampling for correctly sampled data. In theory one could use an even larger kernel to get a closer-to-perfect resampling. However in practice large kernels with a sharply-limited bandpass carry more

<sup>&</sup>lt;sup>8</sup>This feature is currently limited to 2D images.

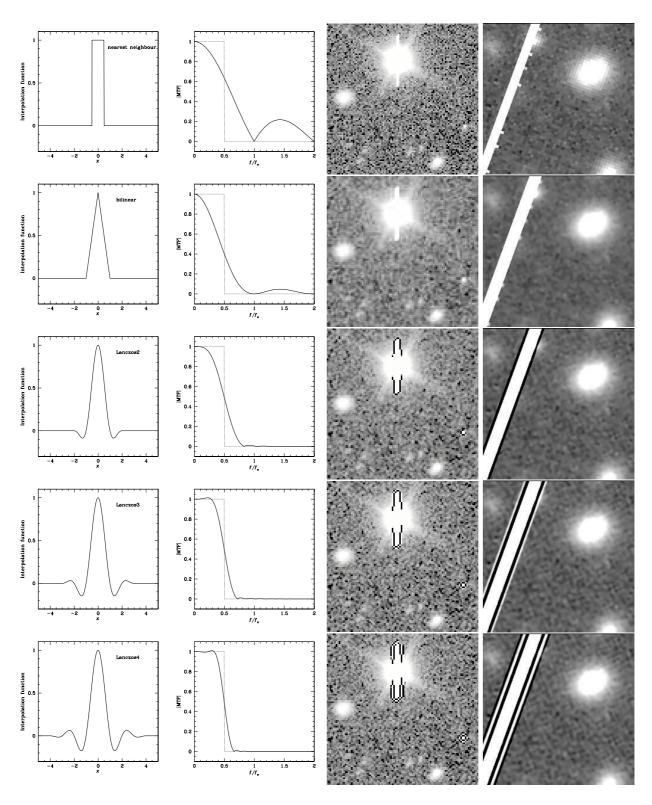


Figure 6: Comparison between resampling methods. From top to bottom: nearest-neighbour, bilinear, Lanczos2, Lanczos3, Lanczos4. From left to right: Interpolation function profile, Modulation Transfer Function, result from shifting an image by half a pixel in both direction, and result for a  $5 \times zoom + rotation$  by 20 degrees.

problems than advantages. Artifacts, image borders or undersampled data generate extended ripples (*Gibbs' phenomenon*). These ripples are obvious on the saturation trail and the cosmic ray impact of the Lanczos interpolations in Fig. 6. In addition, the computational cost becomes prohibitive with multi-dimensional data.

Nearest-neighbour interpolation provides a good conservation of the noise spectrum at scales close to unity; unfortunately, it generates a terrible aliasing when zooming in, and can distort a lot object shapes at places. Its usage should therefore be restricted to images such as flag- or weight-maps.

Bilinear interpolation is fast and doesn't generate negative artifacts. However, it creates a lot of smoothing by correlating the values of neighbour pixels. On images with white noise, this may lead to obvious "moiré" effects (Fig. 7). Nevertheless, bilinear interpolation can be useful for processing undersampled data.

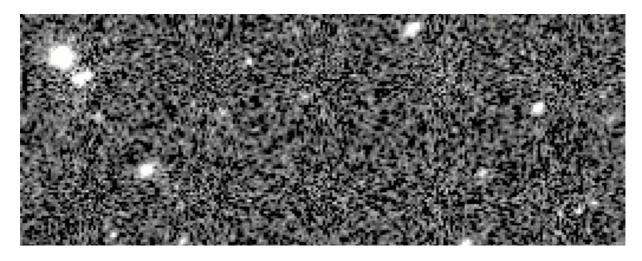


Figure 7: Example of moiré pattern on the background noise, generated by bilinearly resampling an image containing white noise at a pixel scale slightly different from 1.

In general, Lanczos3 resampling represents the best compromise. As can be seen in Fig. 8, it brings a substantial benefit over bilinear interpolation in preserving the signal, while creating relatively modest artifacts around image discontinuities.

#### 5.6.2 Oversampling

Unfortunately the procedure described above generates aliasing when "zooming out" sufficiently an image by resampling it at a lower resolution. Moreover, the intensity of the resampled background white noise stays constant instead of being proportional to the zooming factor (see Fig. 10). This is because the algorithm essentially decimates the data instead of binning them within the output pixel footprint: a similar effect applies in the panning windows of astronomical visualization tools, for instance. This problem can be approximately solved by dilating appropriately the interpolation kernel, or by pre-filtering the input image (like textures in 3D hardware). A more exact and more efficient solution is to oversample the output pixel grid (Fig. 10), in order to obtain a density of samples per unit area (or hypervolume) at least equal to that of the input image.

Oversampling is controlled by the OVERSAMPLING configuration parameter. If OVERSAMPLING is set to 1, no oversampling is applied. An OVERSAMPLING of 2 oversamples the data by  $2^{n_{\text{dim}}}$  samples per pixel, and so on. Oversampling can be different in each dimension: OVERSAMPLING

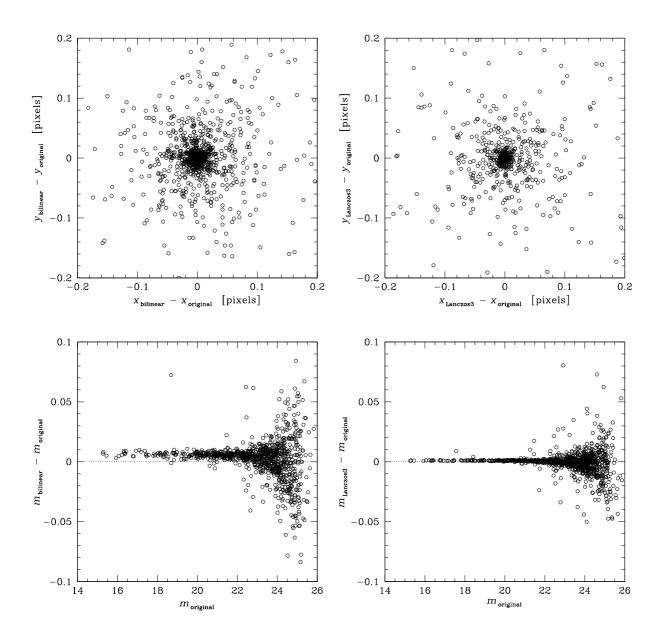
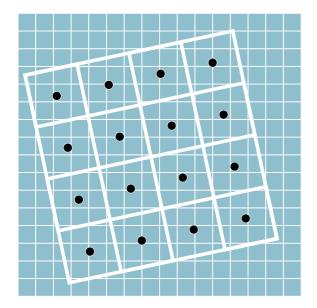


Figure 8: Effects of the resampling on position (top) and flux (bottom) measurements. Left: bilinear interpolation; right: Lanczos3 interpolation. In both cases, a simulated deep sky image with 0.7" seeing, containing stars and white background noise, was rotated by 20 degrees and then rotated back to match the original image. Fluxes were measured in a fixed 2" aperture. The dispersions seen here reflect the differences between measurements on the original and resampled images. These dispersions are much smaller than what one would observe by comparing the measurements on the resampled images with the theoretical (noise-free) positions or fluxes of the simulation. Note however the significant magnitude offset and flux dispersion in the bilinear case, consequences of the stronger smoothing induced by bilinear interpolation.



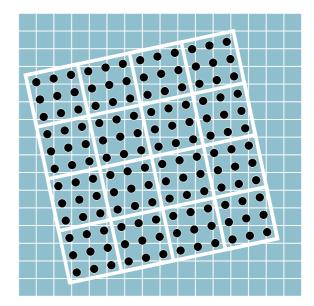


Figure 9: Oversampling in SWARP. The input grid is shown as small grey squares, whereas the output grid (resampled image) is represented by the large tilted ones. *Left*: Without oversampling, only one interpolation (dark spot) of the input image is done at the center of each output pixel. *Right*: with oversampling, several interpolated samples are obtained on a regular subgrid, and then binned in each output pixel. Here a  $3 \times 3$  oversampling is sufficient.

2,3 will oversample each pixel in a  $2\times3$  grid for instance. An OVERSAMPLING of 0 (the default) lets SWARP select automatically the most appropriate oversampling factor in each dimension, by comparing pixel scales at the reference point. Although it works fairly well in many cases, situations where the pixel scale varies a lot over the image — like in all-sky projections — are not yet properly handled, and manual setting should then be prefered.

Note that oversampling considerably slows down the processing; OVERSAMPLING values should therefore be selected with some caution!

#### 5.6.3 Noise stability issues

So far we have ignored the influence of noise variations in the resampling process. In theory, the interpolation schemes described above apply only if the noise is stationary (in the wide sense) over the extent of the interpolation kernel. Artifacts aside, this can be considered as true for the background noise, since the weight-maps are reasonably stable at the interpolation scale. However, the photon noise associated with the sources themselves may vary strongly over the scale of the PSF FWHM. As most astronomical images are barely oversampled, the hypothesis of noise stationarity breaks down on bright point sources for which intrinsic photon noises dominates<sup>9</sup> In the most severe cases, resampled noise peaks may generate distorsions in the resampled profiles.

Low-background-noise simulations were conducted in order to evaluate the amplitude of these distorsions on correctly-sampled data (PSF FWHM = 3 pixels). The effect is small, although not totally negligible on sources with intermediate intensity. On profile-fitting measurements

<sup>&</sup>lt;sup>9</sup>It is possible to stabilize the noise variance using a non-linear dynamic scale transform (Anscombe 1948, see also Stark *et al.* 1998). The transformed signal is still bandpass-limited but unfortunately, resampling and transforming it back biases significantly the data.



Figure 10: The effect of oversampling in SWARP. A deep, real image with a 0.2" pixel scale and 0.8" seeing FWHM is resampled at 1" resolution. *Left*: no oversampling. *Right*: with  $5 \times 5$  oversampling. Note the lower noise level and higher depth in the right image.

for instance, photometry can be affected at the level of a few millimag rms. The degradation of astrometric precision was found not to exceed a few millipixels rms. On typical background-noise limited images the effects are even smaller.

#### 5.6.4 Weight-maps

The processing of the weight-maps (see  $\S 5.9.2$ ) follows that of the data images, except that one is dealing now with variances instead of fluxes. The resampled weight at position  $\mathbf{x}$  may be written as

$$\tilde{w}(\mathbf{x}) = \frac{1}{\sum_{i} \frac{k_i^2(\mathbf{x})}{w_i}} \tag{3}$$

Therefore when an input weight within the range of the interpolation function is zero, the interpolated weight is also zero. The general consequence is that the borders of interpolated images are trimmed by half the range of the interpolation function. Similarly, small "holes" in a provided weight-map are dilated by the interpolation function footprint. For example, once interpolated with a Lanczos4 kernel, a single, isolated zero-weight pixel will yield a clump of about 64 pixels in the resampled image! This is another illustration of the disadvantages in using large interpolation kernels.

# 5.7 Background subtraction

The flux at each pixel is a function of the sum of a "background" signal and light coming from the objects of interest. At most wavelengths, the strongest contribution to the background is of instrumental/atmospheric/ecliptic origin, and is therefore prone to changes between exposures. If not subtracted, the compositing of all these exposures will often produce an ugly patchwork created by all the different individual backgrounds. A solution to this problem is to apply background-subtraction prior to resampling and co-adding the data. Large-scale gradients of

instrumental origin are commonly found on astronomical images, hence subtracting a constant from each frame will generally yield poor results, as shown in Fig. 11). It is therefore necessary to subtract a smooth *background map* which contains the low-spatial-frequency noise components of the data, including any offset. Subtracting a background-map may alter or destroy the signal of scientific interest; thus some caution is needed in choosing parameters for this procedure.

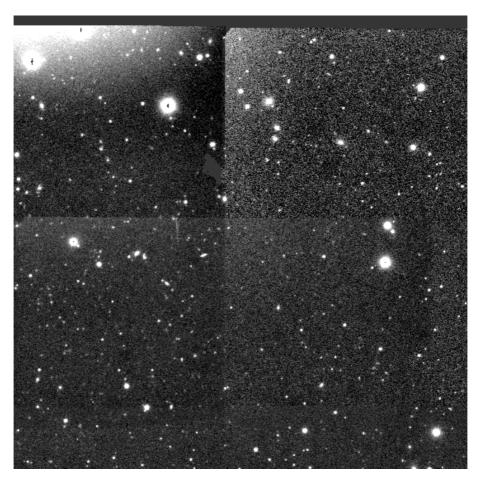


Figure 11: Example of residual gradients in a co-addition after a constant has been subtracted from input images.

Background subtraction is activated by setting the SUBTRACT\_BACK configuration parameter to Y (which is the default). Setting it to N will disable subtraction, but background *estimation* will still take place (it is needed by other SWARP tasks), and the processing time will stay approximately the same.

Background estimation uses SExtractor's algorithm and is controllable with the same keywords<sup>10</sup>. The following is largely copied from SExtractor documentation (Bertin 1999).

To construct the background map, SWARP makes a first pass through the pixel data, computing an estimator for the local background in each mesh of a grid that covers the whole frame. The background estimator is a combination of  $\kappa.\sigma$  clipping and mode estimation, similar to the one employed in Stetson's DAOPHOT program (see e.g. Da Costa 1992). Briefly, the local background histogram is clipped iteratively until convergence at  $\pm 3\sigma$  around its median; if  $\sigma$  is changed by less than 20% during that process, we consider that the field is not crowded and we simply take the mean of the clipped histogram as a value for the background; otherwise we

<sup>&</sup>lt;sup>10</sup>In SWARP All background configuration keywords accept a list of values, one value for each input frame.

estimate the mode with:

$$Mode = 2.5 \times Median - 1.5 \times Mean \tag{4}$$

This expression is different from the usual approximation

$$Mode = 3 \times Median - 2 \times Mean \tag{5}$$

(e.g. Kendall and Stuart 1977), but was found to be more accurate with our clipped distributions, from the simulations we made. Fig. 12 shows that the expression of the mode above is considerably less affected by crowding than a simple clipped mean — like the one used in FOCAS (Jarvis and Tyson 1981) or by Infante (1987) — but is  $\approx 30\%$  noisier. For this reason we revert to the mean in non-crowded fields.

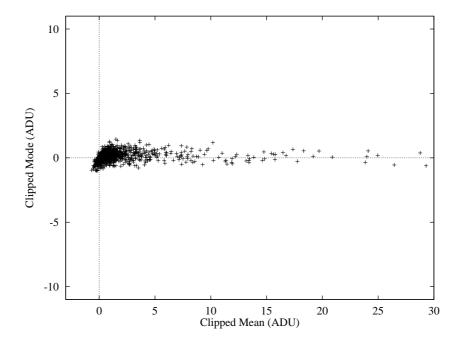


Figure 12: Simulations of  $32 \times 32$  pixels background meshes polluted by random Gaussian profiles. The true background lies at 0 ADU. While being slightly noisier, the clipped "Mode" gives a more robust estimate than a clipped Mean in crowded regions.

The choice of the mesh size (in pixels), BACK\_SIZE, is critical. If it is too small, the background estimation is affected by the presence of objects and random noise. But more important is the fact that part of the flux of extended objects can be absorbed in the background map. The effect may be almost unnoticeable on individual input images (where the signal-to-noise ratio is low), and have measurable photometric consequences on the deep, coadded image. It is therefore advised to use large BACK\_SIZEs in SWARP. Of course if the mesh size is too large, it will not be able to reproduce all the variations of the background; a good compromise has to be found by the user. Typically, for reasonably sampled images, a size of 128 (the default) to 512 pixels should work well.

The final background map is a (natural) bicubic-spline interpolation between the meshes of the grid. Before interpolating, a median filter can be applied to suppress possible local overestimations due to bright stars or artifacts. BACK\_FILTERSIZE sets the size (in background meshes) of the median filter. "1" means no filtering applied to the background grid. Usually a size of 3

<sup>&</sup>lt;sup>11</sup>Obviously in some very unfavorable cases (like small meshes falling on bright stars), it leads to totally inaccurate results.

meshes (the default) is sufficient, but it may be necessary to use larger dimensions, especially to compensate, in part, for small background mesh sizes, or in the case of large artifacts in the images. Median filtering also helps reducing possible ringing effects of the bicubic-spline around bright features. In some specific cases it might be desirable to median-filter only background meshes whose original values exceed some threshold above the filtered-value. This differential threshold is set by the BACK\_FILTERTHRESH parameter, in ADUs. The default is 0.

By default the computed background-map is automatically subtracted from the input image. But there are some situations where it is more appropriate to subtract a *constant* from the image (e.g., images where the background noise distribution is strongly skewed). The BACK\_TYPE configuration parameter (set by default to "AUTO") can be switched to MANUAL to allow for the value specified by the BACK\_DEFAULT parameter to be subtracted from the input image. The default value is 0.

As said before, the background estimation procedure is used not only for background subtraction, but also for other tasks in SWARP, such as weight calibration. Thus even if SUBTRACT\_BACK is set to N or BACK\_TYPE is in MANUAL mode, "reasonable" values for other background parameters must be given to ensure proper working of the software.

Note that the present version of background subtraction doesn't work on non-2D images.

# 5.8 Scaling the flux

How are fluxes modified by image warping? Let us assume F is the integrated flux (in units of  $e^-$  for simplification) of a source of finite extent S that would be recorded on a perfect detector array. In the continuous limit, we define

$$F \equiv \int_{\mathcal{S}} f(\boldsymbol{x}) \, d^2 x,\tag{6}$$

where f(x) is the pixel value at physical position x on the detector. In real life, pixel values are affected by a variable efficiency q, yielding a measured "raw" flux

$$F_r = \int_{\mathcal{S}} q(\boldsymbol{x}) f(\boldsymbol{x}) d^2 x. \tag{7}$$

Digital images are generally divided by a "flat-field" and even a "super-flat" prior to SWARPing. The assumption behind flat-fielding is that the light received from the sky or the dome, and recorded to form the flat-field, has uniform radiance (i.e. constant flux per solid angle). The flux measured on the flat-fielded image is therefore

$$F_f = \int_{\mathcal{S}} \frac{q(\boldsymbol{x})f(\boldsymbol{x})}{f_0 q(\boldsymbol{x})\delta\Omega(\boldsymbol{x})} d^2x = \int_{\mathcal{S}} \frac{f(\boldsymbol{x})}{f_0 \delta\Omega(\boldsymbol{x})} d^2x,$$
(8)

where  $\delta\Omega$  is the local sky area sustained by a pixel (area  $\equiv 1$  in pixel units), and  $f_0$  the scaling factor of the flat-field, which we will set to 1 for the sake of simplicity. As can be seen, flat-fielding does not make the image "flat" in terms of sensitivity; it introduces a dependency with astrometrical distorsion. With most cameras the effect is generally small ( $\leq 1$  millimag). The resampling operations described in §5.6 are designed to conserve surface brightness per pixel, hence the flux recorded on the warped image, with new physical coordinates x' is now

$$F_{fw} = \int_{\mathcal{S}} \frac{f(\boldsymbol{x})}{\delta\Omega(\boldsymbol{x})} d^2x' = \int_{\mathcal{S}} \frac{f(\boldsymbol{x})}{\delta\Omega(\boldsymbol{x})} \left| \frac{\partial x_i'}{\partial x_j} \right| d^2x = \int_{\mathcal{S}} f(\boldsymbol{x}) \left| \frac{\partial x_i'}{\partial \xi_j} \right| d^2x.$$
 (9)

 $\boldsymbol{\xi}$  represents the local (angular) sky coordinate vector. We have made use of the fact that if pixel size is small compared to the rate of change of plate scale (which is almost always true),  $\delta\Omega(\boldsymbol{x})$ 

is equal to the Jacobian of the de-projection  $\left|\frac{\partial \xi_i}{\partial x_j}\right|$ . Now if an equal-area projection is selected for the output image,  $\left|\frac{\partial x_i'}{\partial \xi_j}\right|$  is constant and we have the nice relation  $F_{fw} \propto F$ . This means that swarping properly flatfielded data using an equal-area output projection produces an image with a perfectly flat response to the incoming flux<sup>12</sup>. This is why equal-area projections should be preferred to other projections whenever possible.

Immediately following resampling, the intensity of each image is scaled according to the configuration parameters. The flux-scaling parameter  $p_i$  is the product of two factors: a "photometric" factor, and an "astrometric" one. Currently, the photometric part must be specified by the user (for instance in a pipeline it is generally produced by the photometric calibration process). The photometric factor can be set directly using the configuration parameter FSCALE\_DEFAULT: there must be one value per input image, separated by a coma. It can also be read from the FITS header. The FSCALE\_KEYWORD configuration parameter tells SWARP what FITS keyword to look for in each input image. The default is "FLXSCALE". If the FSCALE\_KEYWORD is not found in the image header, then the FSCALE\_DEFAULT value is taken instead. FSCALE\_DEFAULT is defaulted to 1 for all images.

The astrometric part of the flux-scaling factor corrects for the difference in pixel size between the input and output images. The FSCALASTRO\_TYPE configuration parameter controls the behaviour of this "astrometric" flux-scaling. In the current version, the default behaviour (FSCALASTRO\_TYPE FIXED) is to apply a *constant* correction factor to account for possible mismatches in pixel size. Hence flux is conserved only with equal-area projections. "Astrometric" flux-scaling can also be deactivated by using the FSCALASTRO\_TYPE NONE option. Future versions of SWARP may include variable pixel-scale correction for non-equal-area projections.

# 5.9 Combining resampled images

This is the last part of the processing. Now at each pixel position of the output image, SWARP has to combine data values coming from all the resampled image, each one coming with a rough estimate of its variance (from the resampled weight-map). Many combinations are therefore possible.

#### 5.9.1 Various types of image combination

The user can choose between the following options, as arguments to the COMBINE\_TYPE configuration parameter:

• AVERAGE: The output is simply an unweighted average of all pixel values with non-zero weights:

$$F = \frac{\sum_{i} p_i f_i}{n_{\neq 0}},\tag{10}$$

where  $p_i$  is the flux scaling factor (see §5.8), and the composite weight is

$$W = \frac{n_{\neq 0}^2}{\sum_i \frac{1}{q_i w_i}},\tag{11}$$

 $<sup>^{12} \</sup>mbox{Warning:}$  this flux correction can be extremely inaccurate — 10% error or even more! — for sources that are undersampled on the output image.

where the  $w_i$  are proportional to the inverse of the scaled variance:  $\frac{1}{p_i^2\sigma^2}$ . Needless to say that this combination is not optimum in terms of S/N, unless all input images have identical Gaussian noise.

 $\bullet$  CHI2: The output is the square-root of the reduced  $\chi^2$  of all pixel values with non-zero weights:

$$F = \sqrt{\frac{\sum_{i} w_i f_i^2}{n_{\neq 0}}}.$$
 (12)

By construction, the composite weight (the absolute one) is

$$W \equiv 1. \tag{13}$$

The result of the combination is a so-called " $\chi^2$  image". Although it does not respond linearly to the input signals, it can be used for detecting sources. As shown by Szalay et al. (1999), the " $\chi^2$  image" is indeed the optimum combination to achieve panchromatic detection on a set of images taken at different wavelengths, provided the data sets are background-noise limited and that the noise is uncorrelated between frames. This assumes further that the *Point Spread Function* (PSF) has been homogenized in all channels.  $\chi^2$  images are most often used in deep panchromatic surveys requiring photometric redshift analyses. The double-image mode of SExtractor allows one to detect on the  $\chi^2$  image while making the photometric measurements on each of the single-band images.

• MEDIAN: The output is the median of all scaled pixel values with non-zero weights:

$$F = \operatorname{median}(f_i). \tag{14}$$

Assuming Gaussian noise distribution, we obtain the following approximation to the composite weight (see e.g. Kendall & Stuart 1977):

$$W = \begin{cases} \frac{2}{\pi} \left( \frac{\sum_{i} \sqrt{w_{i}}}{n_{\neq 0}} \right)^{2} \left( n_{\neq 0} + \frac{\pi}{2} - 1 \right) & \text{if } n_{\neq 0} \text{ is even,} \\ \frac{2}{\pi} \left( \frac{\sum_{i} \sqrt{w_{i}}}{n_{\neq 0}} \right)^{2} \left( n_{\neq 0} + \pi - 2 \right) & \text{otherwise.} \end{cases}$$
(15)

This approximation can become inaccurate if  $w_j$  varies by large proportions (a factor of 3 or more) from frame to frame. The median is convenient for combining data polluted by unidentified glitches or noise spikes. It generally provides "safe" (robust) co-additions even with strongly non-Gaussian noise distributions. However it is suboptimal for Gaussian noise: the resulting variance is increased by  $\approx 60\%$  compared to what is obtained with an average. As with all non-linear combinations, one should check that input images have approximately the same Point Spread Function if point-sources are to be co-added. One should also avoid the MEDIAN option when combining images with very different depths.

• MIN: The output is the minimum of all pixel values with non-zero weights:

$$F = \min(p_i f_i). \tag{16}$$

The variance of F is too "noise-distribution dependent" to allow some estimation, hence we set

$$W = \begin{cases} 1 \text{ if } n_{\neq 0} \neq 0, \\ 0 \text{ otherwise.} \end{cases}$$
 (17)

• MAX: The output is the maximum of all pixel values with non-zero weights:

$$F = \min(p_i f_i). \tag{18}$$

The variance of F is too "noise-distribution dependent" to allow some estimation, hence we set

$$W = \begin{cases} 1 \text{ if } n_{\neq 0} \neq 0, \\ 0 \text{ otherwise.} \end{cases}$$
 (19)

Maxima and minima can be useful for identifying defects or rare events in a set of data.

• SUM: The output is an unweighted sum of all pixel values with non-zero weights:

$$F = \sum_{i} p_i f_i. \tag{20}$$

The composite weight is

$$W = \frac{1}{\sum_{i} \frac{1}{a_i \cdot n_i}}.$$
 (21)

Subtractions can be carried out instead of additions by using negative flux scaling factors.

• WEIGHTED: The output is a weighted average of input values:

$$F = \frac{\sum_{i} w_i p_i f_i}{\sum_{i} w_i}.$$
 (22)

The output weight is just the sum of input weights:

$$W = \sum_{i} w_{i}. \tag{23}$$

This combination should be the most appropriate for detecting and measuring faint sources on properly weighted, homogeneous images. Because it is a linear processing, new data can be added later if needed.

#### 5.9.2 Weighted coaddition

Weight-maps provide a convenient way to store the standard flux error assigned to each pixel.

For each input image  $1 \le i \le N$  entering image combination, one can define the following parameters in an arbitrarily small "pixel" j:

- The local, uncalibrated flux  $f_{ij} = \overline{f_{ij}} + \Delta f_{ij}$ , where  $\overline{f_{ij}}$  is the flux contributed by the sky background, and  $\Delta f_{ij}$  that contributed by celestial sources,
- the local, uncalibrated variance of the flux  $\sigma_{ij}^2 = \overline{\sigma_{ij}^2} + \Delta \sigma_{ij}^2$ , where  $\overline{\sigma_{ij}^2}$  is the flux variance contributed by the background noise, and  $\Delta \sigma_{ij}^2$  that contributed by the photon statistics of celestial sources,
- the local, normalized weight  $w_{ij}$
- the electronic gain of the CCD  $g_i$ , in  $e^-/ADU$  (defined at  $w_{ij} = 1$ ),

 $<sup>^{13}</sup> Both$  fluxes and weights may have gone through resampling, but for the sake of clarity we shall from now drop the "  $\tilde{}$  " from §5.6

- the relative flux scaling factor  $p_i$  deduced from the photometric solution to calibrate the images:

$$p_i \Delta f_{ij} = p_l \Delta f_{lj} \quad \forall i, j, l, \tag{24}$$

- and the relative weight scaling factor  $q_i$  derived from the comparison of the background noise level with the normalized weight; input images will be weighted with  $q_i w_i$ .

 $\Delta f_i$ ,  $\Delta \sigma_i^2$ ,  $w_i$  and  $g_i$  are related through:

$$g_i w_{ij} = \frac{\Delta f_{ij}}{\Delta \sigma_{ij}^2}. (25)$$

Now, to optimally co-add calibrated images, one could weight them using

$$q_i w_{ij} = \frac{1}{p_i^2 \sigma_{ij}^2}. (26)$$

However, such weight maps exhibit strong variations on small scales, in the presence of celestial objects ( $\sigma_{ij}^2$  increases a lot on bright pixels). The modulating effect of weighting, combined with variations of the PSF and sampling errors would lead to significant distorsions of stellar profiles. It is therefore more appropriate to weight pixels according to the intensity of the local background noise, which is far smoother:

$$q_i w_{ij} = \frac{1}{p_i^2 \overline{\sigma_{ij}^2}}. (27)$$

This has also the advantage that one can use normalized flat-fields as  $w_{ij}$ 's, without prior knowledge of the CCD gain in the case where instrumental noise is negligeable. For faint objects, this weighting scheme is as efficient as that of (26), and is only suboptimum for the objects with very high surface-brightness, when the  $q_i$ 's vary a lot from exposure to exposure. But as these objects are easily detected on individual exposures, the most accurate photometry is still possible by combining the N measurements.

In practice, SWARP can read several types of weight-maps, although they are all internally converted to variance for processing. The input weight-map format must be specified with the WEIGHT\_TYPE keyword. WEIGHT\_TYPE NONE is for no input weight-map (the default), MAP\_RMS for indicating that the data contain the absolute standard deviation of pixel values, MAP\_VARIANCE, for weight-map data stored as relative variances, and MAP\_WEIGHT for relative weights. Relative variances or weights are scaled internally using local variance measurements made directly on the input images.

When producing composite fields larger than the input images, the latter must be background-subtracted prior to coaddition, to avoid generating discontinuites in the output image. Thus one can write the output coadded flux as

$$\Delta f_j = \frac{\sum_i q_i w_{ij} p_i \Delta f_{ij}}{\sum_i q_i w_{ij}} = p_l \Delta f_{lj} \quad \forall l,$$
 (28)

and the resulting variance as

$$\Delta \sigma_j^2 = \frac{\sum_i q_i^2 w_{ij}^2 p_i^2 \Delta \sigma_{ij}^2}{(\sum_i q_i w_{ij})^2}.$$
 (29)

Using (25), an equivalent "local gain"  $G_i$  in the coadded image can be computed:

$$G_j w_j = \frac{\Delta f_j}{\Delta \sigma_j^2} = \frac{\sum_i q_i w_{ij} p_i \Delta f_{ij}}{\sum_i q_i^2 w_{ij}^2 p_i^2 \Delta \sigma_{ij}^2} \cdot \sum_i q_i w_{ij}, \tag{30}$$

where  $w_j$  is the composite weight-map of the coadded image. From our definition of weights,  $w_j$  is inversely proportional to  $\overline{\sigma_j^2}$  and must be 1 if all input weights are at 1; hence it is easy to show that

$$w_j = \frac{\sum_i q_i w_{ij}}{\sum_i q_i}. (31)$$

Substituting (31) in (30), and using (24) and (25), one gets

$$G_j = \frac{\sum_i q_i w_{ij}}{\sum_i q_i^2 w_{ij} p_i g_i^{-1}} \cdot \sum_i q_i.$$
 (32)

Unfortunately, as can be seen, this "coadded gain" will vary with position in the general case. Nevertheless, some approximations can be made to simplify this expression. First of all, in most cases,  $g_i$  will be almost constant from one input image to another. Second, if exposures are taken under photometric conditions with constant sky brightness and negligible instrumental noise, one should have  $q_i \propto p_i^{-1}$ , removing the dependence with input weights, and therefore position in the coadded image. In that very case, the resulting gain is simply

$$G \approx g \sum_{i} p_i^{-1}.$$
 (33)

Sadly, in many bands, the presence of clouds does not decrease the sky brightness as much as source brightness, and doesn't act at all like a decrease in global sensitivity or exposure time. Coadded regions of a survey that are taken under non-photometric conditions experience fluctuating "gains". But this effect is generally small: taking the quite unfavourable case of  $q_i \propto p_i^{-2}$  (constant background noise) with  $p_i$ 's varying by a factor of 4 between two exposures, and weights varying from 0.5 to 1, makes  $G_j$  to vary by 20% at most. This should not cause significant difficulties in any profile fitting routine. Therefore (33) still remains a very good approximation in the general case, and the "coadded gains" provided by this method are still more stable than what unweighted co-addition offers.

This does not prevent regions with lower coverage (in which N is smaller) having lower gains. To avoid large gain drops in the gaps of CCD mosaic images, it is recommended for the observations to use large, random dithering patterns consisting of at least 4-5 exposures per covered sky area.

#### 5.9.3 Image buffering and memory constraints

In order to maximize the efficiency of the image combination process, SWARP version 2.0 and above allocates a significant amount of memory to buffer input and output data. This amount of memory can be set by the user with the COMBINE\_BUFSIZE configuration parameter. The default value for COMBINE\_BUFSIZE is 64 (Megabytes). If your machine is a bit short of memory you should decrease this value. Conversely if you need to combine a large number of overlapping images, you might want to set COMBINE\_BUFSIZE to a substantial fraction of the memory available on your machine to avoid "disk thrashing".

#### 5.9.4 Overlap information

SWARP uses the Bron and Kerbosh algorithm (1973) based on FITS header information to estimate the maximum number of input frames that overlap and optimize the management of its internal buffers. The maximum overlap density is displayed on screen prior to image combination and can be found in the output XML meta-data. Note that this estimate is somewhat approximative as it ignores input weights (which can be zero over significant fraction of the

overlap), and that there can only be one single overlapping frame per multi-extension FITS input file.

The maximum overlap density is also used for computing the maximum accumulated exposure time and maximum equivalent gain in the output frame. The maximum exposure time is simply the sum of all the exposure times from the individual overlapping frames. The maximum equivalent gain is computed using (32) for COMBINE\_TYPES AVERAGE, SUM and WEIGHTED. For all other COMBINE\_TYPEs the equivalent gain is just the average input gain in the overlap after the scaling of pixel values.

# 6 Two-step co-addition and resampling

All the operations described so far can be done in one single run of SWARP. This generally sufficient for small projects, which usually involve observations conducted over a short period of time. However, for large sky surveys that can extend over years, this implies "waiting" for the data to accumulate after passing through the reduction pipeline. In this case SWARP would only be started once all the fields that cover a given sky area are available. Much of SWARP processing time is spent in resampling the data; therefore for projects that extend over a long period of time, it would be more efficient to resample the images as they come out of the reduction pipeline. The remaining of the work, co-addition, could be done at a later date.

To solve this problem, versions  $\geq 1.32$  of SWARP allow the internal processing pipeline to be split in two: image-resampling and image-combining. If the COMBINE configuration parameter is set to N, SWARP stops right after having background-subtracted and resampled the input images. The DELETE\_TMPFILES option is then automatically deactivated.

To combine images resampled at an earlier stage, RESAMPLE should be set to N: in that case SWARP will skip all the background-subtraction and resampling stage, and jump directly to the combine process. Prior to version 2.0 this feature only worked with input resampled images produced by SWARP, because of some specific information needed in the FITS header. Since version 2.0, any FITS image can be used. However, when RESAMPLE is set to N, SWARP combines input images with the implicit assumption that they all share the same CRVAL and CDELT WCS parameters: images are placed in the final frame according to their NAXISN's and the integer part of their CRPIX's. The RESAMPLE N feature can be used for instance to extract sub-images, or paste input images within an arbitrary empty frame.

Setting both RESAMPLE and COMBINE to N will not produce any output file, but can be useful to check the content of input data or to adjust output astrometric parameters. By default, RESAMPLE and COMBINE are both set to Y.

It may sometimes be useful to create only the header of what will become the combined image; for instance for generating an output ".head" file that will define the output projection system. Such a ".head" file can then be copied to several machines that will resample input images to a common projection, for later co-addition. This can be done by setting the HEADER\_ONLY configuration parameter to Y; processing will stop before resampling like in the case where RESAMPLE and COMBINE are set to N, but this time the header of the output image will be written to disk.

# 7 Examples

In the following, examples of use of SWARP are given, together with commented configuration files.

## 7.1 Example 1

Let us assume one wants to produce a full-sky Aitoff representation in galactic coordinates of a series of observed fields stored in \*.fits 2D files( with WCS info), for illustration purposes. The files might be dummy ones, supplemented with hand-made headers, or obtained from virtual telescopes such as  $SkyView^{14}$ , or real ones. In all cases an additional full sky map is useful to delimit the full-sky: one may for instance download a 360 degrees Aitoff projection of COBE-DIRBE data from SkyView. The syntax is

```
\% swarp *.fits
A possible default.swarp configuration file is
IMAGEOUT_NAME
           coadd.fits
WEIGHTOUT_NAME coadd.weight.fits
#----- Input Weights -----
WEIGHT_TYPE
           MAP_WEIGHT
                              # Not used here
WEIGHT_SUFFIX
           .weight.fits
WEIGHT_IMAGE
#----- Co-addition -----
COMBINE_TYPE
                              # This coaddition is for illustration
           AVERAGE
                              # only: the weight-map will contain
                              # a sum of field footprints
#----- Astrometry ------
CELESTIAL_TYPE GALACTIC
                              # Coordinate system forced to galactic
PROJECTION_TYPE AIT
                              # Code for Aitoff
CENTER_TYPE
           MANUAL
                              # Imposed to alpha = delta = 0.0
            00:00:00.0, +00:00:00.0 #
CENTER
PIXELSCALE_TYPE MANUAL
                              # The full sky area will exceed the
                              # fraction that contains the fields
PIXEL_SCALE
           1800.0
                              # in arcsec: Half a degree per pixel
                              # at image center, on both axes
                              # 360/0.5 = 720, 180/0.5 = 360,
IMAGE_SIZE
           800,400
                              # plus a margin
#----- Resampling ------
```

<sup>14</sup>http://skyview.gsfc.nasa.gov

RESAMPLING_TYPE  OVERSAMPLING  INTERPOLATE	BILINEAR 4 N	<pre># For illustration purposes, no need # for a sophisticated interpolation # A small oversampling only to have # pretty, antialiased field limits</pre>
GAIN_KEYWORD	GAIN	
GAIN_DEFAULT	0.0	
#	Background	subtraction
SUBTRACT_BACK	N	# No background subtraction
BACK_TYPE	AUTO	
BACK_DEFAULT	0.0	
BACK_SIZE	128	
BACK_FILTERSIZE	3	
#	Virtual memo	ry management
VMEM_DIR		
VMEM_MAX	2047	
MEM_MAX	128	# 128 MB should be enough to avoid
		# swapping
#	Miscell	aneous
DELETE_TMPFILES VERBOSE_TYPE		# Delete temporary resampled FITS files

In this application, coverage maps can be generated using the output weight-map instead of the image itself.

# 7.2 Example 2

In this example, one has a set of CCD images taken with a standard dithering strategy, input\*.fits, and the related set of weight-maps input\*.w.fits However the unusual thing is that for some reason the output has to be tilted by 30 degrees with respect to the local north-south axis, and the pixels must have an aspect ratio of 16:9!

First, one starts with a fairly standard configuration file:

#	Out	put
IMAGEOUT_NAME WEIGHTOUT_NAME	<pre>coadd.fits coadd.weight.fits</pre>	<pre># Output filename # Output weight-map filename</pre>
#	Input	Weights
WEIGHT_TYPE	MAP_WEIGHT	<pre># # (all or for each weight-map)</pre>
WEIGHT_SUFFIX	.w.fits	# Suffix to use for weight-maps

WEIGHT_IMAGE		<pre># Weightmap filename if suffix not used # (all or for each weight-map)</pre>
#	Co-add:	ition
COMBINE_TYPE	WEIGHTED	# weight-maps are provided
#	Astron	metry
PIXELSCALE_TYPE PIXEL_SCALE IMAGE_SIZE	TAN ALL 00:00:00.0, +00:00:00.0 MEDIAN 0.0	# Standard stuff # A tangent projection will do # We want all the data to fit in # Not used in CENTER_TYPE ALL mode # Will be overriden by coadd.head # Not used in MEDIAN mode # Automatic sizing
#	Resam	pling
RESAMPLING_TYPE OVERSAMPLING INTERPOLATE GAIN_KEYWORD GAIN_DEFAULT	O N GAIN	<pre># High quality resampling # Auto. oversampling (=1 in that case)</pre>
#	Background	subtraction
SUBTRACT_BACK BACK_TYPE BACK_DEFAULT BACK_SIZE BACK_FILTERSIZE	0.0 128	# Needed for co-adding dithered fields
#	Virtual memo:	ry management
VMEM_DIR VMEM_MAX MEM_MAX	2047 128	<pre># 128 MB should be enough to avoid # swapping</pre>
#	Miscella	aneous
DELETE_TMPFILES VERBOSE_TYPE		# Delete temporary resampled FITS files

To implement the unusual output features required, one must write a coadd.head ASCII file that contains a custom anisotropic scaling matrix. A coadd.head for pixels 0.2" large, that tilts the image by 30 degrees and applies a 16:9 anamorphosis to the data would be:

 $CD1_1 = 6.4150E-5$  $CD1_2 = 2.0833E-5$ 

```
CD2_1 = -3.7037E-5

CD2_2 = 3.6084E-5

END
```

# 8 Troubleshooting

In case you face a problem which not listed below, please do not hesitate to discuss it in the SWARP section of the TERAPIX forums<sup>15</sup>.

## My window terminal crashes during a long SWARP run!

Unexpected crashes of XTERM windows have been reported. This seems to be caused by the large number of ANSI control sequences that SWARP sends to the terminal. You may either set the SWARP configuration keyword VERBOSE\_TYPE to QUIET or FULL, and/or redirect the output to a file.

SWARP crashes with error messages like "> \*Error\*: pthread\_create() failed...".

The multithreaded version of SWARP requires a fairly large stack, that may exceed the maximum value allowed by your shell. Use the shell command limit to increase the stacksize parameter if required (you might need the root privileges to change this if it is a "hard" limit).

SWARP crashes with error messages like "> \*Error\*: Not enough memory for...", although I have properly set the MEM\_MAX VMEM\_MAX parameters.

The maximum value allowed by your shell for memory use might be set too low. Use the shell command limit to increase the datasize, memoryuse and vmemoryuse parameters if required (you might need the root privileges to change this if it is a "hard" limit).

SWARP crashes with error messages like "> \*Error\*: cannot open for reading..." during the co-addition phase, although it had no problem accessing the same files for resampling.

The maximum number of open files allowed by your shell might be set too low. Use the shell command limit to increase the descriptors and openfiles parameters if required (you might need the root privileges to change this if it is a "hard" limit).

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<sup>15</sup>http://terapix.iap.fr/forum

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