

A High Performance Spatial **Auto-Correlation Application**

Description

Associates multi-epoch source observations in massive astronomical databases Used for 2MASS Merged Source databases, but generally applicable (e.g. to WISE)

The publicly released 2MASS catalogs were generated by running source extraction software on raw image data from many roughly rectangular regions on the sky. These regions often overlap, producing multiple extractions (apparitions) of a single astronomical source. In such situations, 2MASS chose a "best" apparition to include in the source catalogs. Consequently, there are many extractions for which data is not publicly available and astronomers are unable to identify "best" apparitions with algorithms of their choice.

The WAX software addresses these issues by generating groups of apparitions likely to correspond to single astronomical sources. These groups are made available as a catalog along with the complete database of extracted apparitions. The grouping algorithm employed is conservative in the sense that if an apparition is assigned to more than one group, then that apparition and the groups containing it are flagged as confused, but no attempt to resolve confusion is made (information loss is avoided).

WAX is written in portable C/C++, but has only been run on the Solaris SPARC platform. All I/O is performed directly from/to an RDBMS (currently limited to Informix), thereby saving disk space and database loading time, and allowing output tables to be gueried and served immediately.

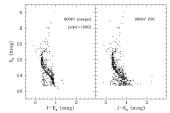
The grouping (swiss cheese) algorithm is hardwired, and places minimal constraints on the input DBMS table: a per-apparition unique identifier and position suffice to run WAX. The output group catalog will always contain a unique identifier, apparition count, and confusion flag for each group. Also, group/apparition identifier pairs are stored in a link catalog, allowing for the retrieval of all apparitions belonging to a group, or of all groups containing an apparition. Finally, it is important to note that WAX can process subsections of the entire sky, either serially or in

WAX plug-ins can be written to compute arbitrary group attributes (e.g. average position/magnitude) and to choose a "best" group for apparitions belonging to more than one. At compile-time, a plug-in provides a retrieval and output column specification from which C structures corresponding to the columns are generated. This compile time knowledge of columns is also used to generate high performance database IO code (ESQL/C). At run-time, each generated group and each grouped apparition is passed to the plug-in implementation via the generated data structures. This hides complexity from the plug-in and results in a simple interface (described in a single C header file). As well, libraries are provided for common plug-in tasks such as computing the observational coverage and spatial index of a position.

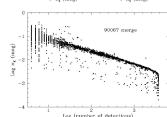
Taken together, these features allow WAX to be tailored to an apparition database, and extend its usefulness to missions beyond 2MASS.

Below are figures from a 2MASS analysis of WAX output for both point and calibration sources. A pre-filtered copy of the 2MASS Working Point Source Database (~800 million apparitions) was processed by 4 instances of WAX running in parallel for roughly 4.5 days (~1.1 million seconds total CPU time).

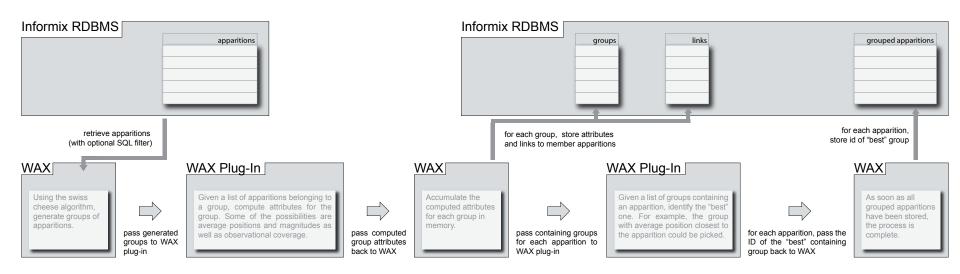
A side-by-side comparison of the color-magnitude diagrams (CMDs) for stars in the 90067 calibration field from the merged WAX output and the single-scan depth 2MASS Point Source Catalog. The left panel shows the CMD from the merged source information table for all course containing apparitions from 1000 or more scans. The right panel shows the CMD formed from the Point Source Catalog in the same region.



The standard deviation of the mean 2MASS K, magnitude plotted as a function of the number of K detections for merged sources in the 90067 calibration field. The slope of the main locus of points verifies that the standard deviation decreases at the standard deviation decreases at the standard deviation decreases at the standard deviation deviation. the standard deviation decreases as the square root of the number of detections, as expected for Gaussian statistics. The vertical spread at any given number of detections is caused by the brightness distribution of the sources - brighter sources have smaller intrinsic uncertainties. This illustrates that the merge has source, and not constructed false matche



Architecture



Algorithms

Swiss Cheese Algorithm

The swiss cheese algorithm first computes both a density and a centroid for each apparition on the sky. The density for an apparition a is defined as the number of apparitions within a specified angular distance d of a. The centroid is defined as the average position of all the apparitions contributing to the density of a.

Next, the apparitions are sorted into decreasing *density* order. Each apparition in the resulting queue is considered to be a seed; that is, an unprocessed apparition from which a group can potentially be generated. Starting with the apparition at the head of the queue (the *densest seed*),

ullet All apparitions within a specified angular distance r of the seed centroid are assigned to a new group.

unprocessed apparitions. Note that the head of the queue will always be removed.

If the queue is non-empty, the process is repeated with the new queue-head.

In some circumstances, the algorithm assigns a giver appartition to more than one group. Appartitions belonging to two or more groups (and the groups containing them) are said to be *confused*. The diagrams to the right present a step by step illustration of the swiss cheese algorithm and how confusion arises.

Since the apparition databases being processed are far ge to fit in memory, a straightfor of the algorithm is difficult at best. The WAX software parti tions the sky into declination bands to reduce the working set of apparitions, and, instead of processing seeds in den-sity order, performs multiple passes over the seeds in spa-tial order. This is done to allow for efficient computation of densities, centroids, and groups, each of which involve find ing apparitions within a small radius of a position. Every pass over the set of seeds will only generate groups and dis-card seeds if doing so does not violate the density ordering constraints imposed by the swiss cheese algorithm.

Because WAX cannot consider the sky in its entirety, it is Decades WAX failing consider life sky in its eninety. It is possible for spatial traversals of a single declination band to result in an impasse; that is, a situation in which the gen-eration of any group would be set used to successive situation with those of the swiss cheese algorithm. In such cases, WAX attempts to minimize the deviation incurred.

The diagrams to the right depict the spatial subdivision scheme and traversal order used by WAX, and demonstrate how apparitions are processed out of density order:

· A group is generated around a seed centroid if and only if seed would not be included in any group generated from



drawn in black



The third group generated

The entire sky, subdivided into declination bands.

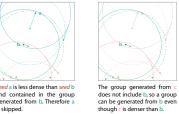


The fourth group further con-





lanes and traversed in spatial order (shown by the pink line).







the group generated from b: c is denser than b and remains in the processing queue.

Scan Coverage Algorithm

in is a quadrilateral on the unit-sphere approximating an area for which raw image data is available and has been used for appari-tion extraction. The scan coverage algorithm determines how many such scans cover a particular position on the sky; that is, it deter-mines how many apparitions of an astronomical source to expect at a chief position.

The sky is first subdivided into coarse bins which cover small equal width ranges in right ascension and declination. By testing a position only against the scans overlapping the bin covering the position, many coverage tests are avoided. To further improve efficiency, a binary space partitioning tree (BSP tree) is generated offline from the set of scans overlapping each bin, and is traversed at runtime for



The entire sky, subdivided into





BSP trees are created from a set of scans by recursively splitting the set against scan edges. The process, illustrated below, produces a binary tree in depth first order, where nodes correspond to splitting planes and leaves are convex polygons inside of which scan coverage is constant (no leaf contains a scan edge).



The scans are split by the first





Depth of coverage map for the

the shallowest in black

