Modular Algorithm Testbed Suite (MATS) User Manual

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1 Introduction

The Modular Algorithm Testbed Suite (MATS) is a software package for the development and testing of automatic target recognition (ATR) algorithms. It employs an open, modular architecture to provide developers with a quick and easy way to test and compare algorithms. MATS is written using the MATLAB® programming language and requires version 2009b or later and the Image Processing Toolbox to run properly.

To run MATS, copy the MATS package to a folder on the hard drive. Start MATLAB® and make the root folder of the MATS package the current working directory. This can be done either via the MATLAB® command prompt (indicated by >>) or by using the 'Current Folder' panel in the graphical interface. Then run the file testbed_gui.m by typing testbed_gui into the command prompt. At this point, the user should configure run-time parameters as described in Section 4.

This document is intended to give developers of ATR algorithms an overview of how the MATS system works, how it can be used, and how additional modules can be integrated into it. Sections 2 and 3 describe the basic structure of MATS. Section 4 details the GUI configuration options and Section 5 describes expected run-time behavior. Procedures for integrating custom modules are included in Section 7. Addition information regarding feedback classifier integration is included in Appendix A.

1.1 Distribution

This document, the source code of the MATS framework, and the included sample modules (Test, Test_multi, and No_extra), are all Distribution A and may be freely distributed. However, this may *not* be true of all modules located within the MATS directory structure. If you have received more restricted algorithms, appropriate measures must be taken to avoid distribution of these algorithms to unauthorized entities.

2 MATS Modules

The bulk of the processing occurs in the individual components of the MATS system, which are called *modules*. Modules are organized into various categories, or *pools*, based on their function. Each pool has a specific and unique function to perform within the ATR processing stream:

- A *data reader* converts a data file from some format to the standardized MATS input structure detailed in Section 3 .
- A *detector* takes in an image and returns a list of contacts representing objects of interest in the area covered by the image(s) provided.
- A *feature extraction* algorithm creates a feature vector to represent each contact for the purpose of classification.

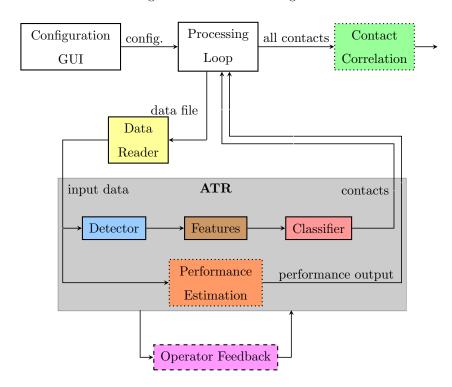


Figure 1: MATS Flow Diagram.

- A *classifier* discriminates between targets and non-targets.
- A *performance estimation* algorithm estimates an expected level of performance of the ATR based on properties of the image.
- A *contact correlation* algorithm attempts to identify which contacts are actually the same object from different images.

All components within the same type perform similar tasks and are thus completely interchangeable, provided that the data standards defined in Section 3 are met. The specific algorithm to be run is determined at run time via the MATS graphical user interface (GUI) module selection menus, which are detailed in Section 4.2.

3 Data Structures

The data structures described in this section are the means by which the different modules communicate with each other. The standardization here plays a crucial role in making the MATS suite a modular tool.

3.1 The Input Structure

The input structure contains all of the data that is passed into the ATR module. It represents an image and other data associated with an image (e.g., resolutions, vehicle data, etc.). The complete list of input structure fields is listed in Table 1.

Table 1: Fields of the Input Structure.

float	High frequency (HF) image (complex) Cross-track (range) resolution of the HF image (in m)
	Cross-track (range) resolution of the HF image (in m)
float	cross track (range) resolution of the III mage (III m)
noat	Along-track resolution of the HF image (in m)
int	Cross-track (range) dimension of the HF image (in pixels)
int	Along-track dimension of the HF image (in pixels)
rix (float)	Broadband (BB) image (complex)
float	Cross-track (range) resolution of the BB image (in m)
float	Along-track resolution of the BB image (in m)
int	Cross-track (range) resolution of the BB image (in pixels)
int	Along-track resolution of the BB image (in pixels)
string	side of vehicle from which the image was taken =
	{'PORT', 'STBD'}
ay (float)	latitude of vehicle (in degrees)
ay (float)	longitude of vehicle (in degrees)
string	filename of image file/some other image ID
int	1 = ground truth data available; 0 = no ground truth
	available
y (struct)	ground truth info for this image (Refer to Table 2 for
	details.)
string	type of target the detector is trying to detect^1
struct	parameters required for the performance estimation code
	(Refer to Table 3 for details.)
ay (float)	nominal heading of the vehicle (in radians)
ay (float)	time stamp (UTC)
string	sensor ID string
char	run-time mode: 'A' = ATR only; 'P' = performance es-
	timation only; 'B' = both
	int crix (float) float float int int string ay (float) ay (float) string int cy (struct) string struct ay (float) ay (float) string

Field	Data Type	Description	
.sweetspot array (int)		range pixel bounds on area of image suitable for ATR	
		processing	

Table 2: Fields of the .gtimage Substructure.

Field	Data Type	Description	
.x, .y	arrays (int)	location of ground truth object (in pixels)	
.side	string	side of vehicle where the ground truth object	
		is located: 'PORT', 'STBD'	
.num	array (int)	identifier for ground truth object	
.fn	string	filename of image file/some other image ID i	
		which this ground truth object is located	
.type	int	object type (for multi-class classifiers only): -	
		99 = unknown	

Table 3: Fields of the .perfparams Substructure.

Field	Data Type	Description
.height	array (float)	height of the vehicle at each ping (in m)
.depth	array (float)	depth of the vehicle at each ping (in m)
.maxrange	float	maximum range (in m)

3.2 Performance Estimation

Table 4: Fields of the Performance Estimation Output Structure.

Field	Data Type	Description
.pdpc matrix (float)		probability of detection and classification
		at each pixel (same size as input image)
.pfa	matrix (float)	probability of false alarm at pixel

¹Valid options include: 'wedge', 'truncated cone', 'cylindrical', 'torpedo', 'sphere', 'bomb', 'box', 'can', 'coffin', 'disk', 'ellipsoidal', 'elongated sphere', 'fish', 'hemisphere', 'irregular', 'ovoid', 'rectangular box', 'sphere with horns', 'teardrop', 'triangular', 'unspecified'

Field	Data Type	Description
.A	float	average effective range (whole image)
.B	float	average P_dP_c (whole image)
.py	array (float)	average P_dP_c vs. range (for image)
.ATRstatus	char	stoplight performance indicator:
		 'r' = red (P_dP_c < .5 OR P_{fa} > .5 OR number of positive contacts in current image > 10) 'y' = yellow (P_dP_c < .7 OR P_{fa} > .3 OR number of positive contacts in current image > 5) 'g' = green (otherwise)

3.3 Contact List

The contact list is an array that represents the output of the ATR processing. Each element of the array represents an individual object and has the fields associated with it as listed in Table 5. The background color of the field entry coordinates with Figure 1 and indicates when the actual field values are generated.

Table 5: Fields of Elements the Contact List.

Field	Data Typ	e Descri	Description		
.ID int		unique	unique identifier for each contact list element		
.x, .y ints		location	location of contact in the image in pixels (centroid)		
.features array (float)) feature	features used to classify contact		
.fn strin		filenam	filename of image file/some other image ID		
.side	string	side of	side of vehicle: {'PORT', 'STBD'}		
.gt int		ground	ground truth value of contact (if known): $1 = object$		
		really is	s a target; $0 = \text{object really}$	y is not a target; empty	
		= grou	nd truth value unknown		
.type int		object	object type (if known): -99 = unknown		
T 1	ATR shell	Input	Contact correlation	Feature extraction	
Legend	Classifier	Detector	Performance estimation	Operator feedback	

Field	Data Type	e Descri	Description				
.class	int	1 = cla	1 = classified as relevant; $0 = $ classified as not relevant				
.classconf	float	probab	probability that classification of contact is correct (0 $<$				
		.classco	.classconf $< 1)$				
.detector	string	detecto	r identifier				
.featureset	string	feature	feature set identifier				
.classifier	string	classifie	classifier identifier				
.contcorr	string	contact	contact correlation identifier				
.opfeedback	struct	operato	operator feedback (see structure below)				
.normalizer	string	normal	normalizing algorithm used (empty string if none)				
.ecdata_fn	string	name o	name of file that contains the remaining contact data				
T 1	ATR shell	Input	Contact correlation	Feature extraction			
Legend	Classifier	Detector	Performance estimation	Operator feedback			

Table 6: Fields of opfeedback Substructure.

Field	Data Type	Description	ı		
.opdisplay	int	operator	display	mode:	
		0 = don't s	how this contact		
		1 = show i	and confirm (likely	a	
		target; oper	cator can veto)		
		2 = show a	nd ask (unsure; ope	er-	
		ator must r	espond)		
.opconf	int	operator	confidence	feedback:	
		1 = likely c	lutter		
		2 = less likely clutter			
		3 = unsure,	could be either		
		4 = less like	ely a target		
		5 = likely a target			
.type	int	operator object label (for multi-class classi-			
		fiers only): -99 = unknown			

As of MATS version 1.1, some of the contact data is written to disk instead of being included in the contact list data structure. To access this data for a given contact, the binary file designated in its ecdata_fn field must be read. This can be done using the read_extra_cdata function, which will return a data structure

containing the fields listed in Table 7.

Table 7: Supplementary Contact Data Fields.

Field	Data Ty	pe Des	Description		
.ID	int	unio	unique identifier for each contact list element		
.hfsnippet	matrix (flo	oat) area	area around contact in h.f. image (complex)		
.bbsnippet	matrix (flo	oat) area	area around contact in b.b. image (complex)		
.lat	float	latit	latitude of contact (in degrees)		
.long	float	long	longitude of contact (in degrees)		
.groupnum	string	ID :	ID $\#$ of this contact's group; unique for each real ob-		
			ject; many images may have objects with the same group $\#$		
.groupclass	int	1 =	1 = group classified as relevant; 0 = group not classified		
			as relevant		
.groupclasscon	f float	prol	probability that classification of group is correct		
.groupconf	float	prol	probability that this contact belongs in this group (and		
		repi	represents the same object)		
.grouplat	float	latit	latitude of group (in degrees)		
.grouplong	float	long	longitude of group (in degrees)		
.groupcovmat	matrix (flo	oat) grou	group lat/long covariance matrix (2x2)		
.heading	float	non	nominal heading of the vehicle (in radians)		
.time	float	time	timestamp (UTC)		
.alt	float	heig	height of vehicle at contact ping		
.hf_cres	float	HF	HF image cross-track resolution (in m)		
.hf_ares	float	HF	HF image along-track resolution (in m)		
.hf_cnum	int	HF	HF image cross-track dimension (in pixels)		
.hf_anum	int	HF	HF image along-track dimension (in pixels)		
.bb_cres	float	BB	BB image cross-track resolution (in m)		
.bb_ares	float	BB	BB image along-track resolution (in m)		
.bb_cnum	int	BB	BB image cross-track dimension (in pixels)		
.bb_anum	int BB image along-track dimension (in pixels)				
.veh_lats	array (float) latitude of vehicle				
Legend	ATR shell	Input	Contact correlation	Feature extraction	
Logona	Classifier	Detector	Performance estimation	Operator feedback	

Field	Data Type		Description		
.veh_longs	array (fl	oat) long	longitude of vehicle		
.veh_heights	array (float) height of the vehicle at e			ing (in m)	
Legend	ATR shell	Input	Contact correlation	Feature extraction	
	Classifier	Detector	Performance estimation	Operator feedback	

Configuring the GUI

The configurable GUI front end of the MATS suite (testbed_gui.m) allows the user to customize the input arguments of the system. It also allows for partial control over the run-time process via several adjustable parameters. Indented items are dependent on the value of the non-indented items above them. For example, the values selected for the plotting options are irrelevant if showing the images is disabled.

I/O Data 4.1

This portion of the GUI requires the user to choose which data file(s) to process and where the results should be stored.

Source Directory

The source directory is the folder containing the data files to be processed. Each file in the folder should be of the same file format. This is a required field, unless using preprocessed detections.

File Format Menu

The selection of the file format determines how MATS will attempt to read the selected file(s). All supported file formats are listed in the format selection menu.

I/O Data *Source directory: Choose Old .mat (Bravo) File format: * ONR SSAM + Sensor: Use file: Use index range... + Start index: End index: Choose Groundtruth filename: Choose *Output directory:

Figure 2: The 'I/O Data' Section of the GUI.

Sensor Menu

The 'Sensor' selection modifies the run-time parameters of algorithms. Due to differences in the sensors, a particular configuration for an algorithm may not work on all sensors, as algorithms are incompatible with certain sensors. It is assumed that if the user is trying to use an algorithm, he knows enough about it to make the appropriate selection. As such, the MATS GUI will not prevent you from choosing an algorithm that does not work with the selected sensor format, or vice versa. Algorithm developers should use this value, found in the .sensor field of the input structure, to only process data that their algorithm is equipped to properly handle.

File Selection Menu

The file selection menu lists the valid data files found by the MATS GUI. The items shown in this list depend on what file format is selected; changing the file format will update the list of available files. The user may select an individual file for processing, or process a range of files. Choosing 'Use index range...' will automatically fill the index selection fields below with the proper indices required to process all of the files in the list, but the user may manually change these if necessary.

(Note: Currently, the file extension determines if a file is of the right "type". Therefore, it is possible for other files of a different "type" to show up in this list if they have the same file extension. Store only one type of data in a directory for best results.)

Ground Truth File

The ground truth file contains information relating to the true positions of the objects in the data. Having a ground truth file is not required for MATS execution.

Output Directory

The output directory is where the output files will be stored after the ATR processing of an image has been completed. This is a required field in all circumstances. (Note: When the new output files are saved, they will overwrite any previous results within this directory that have the same filenames.)

4.2 ATR Modules

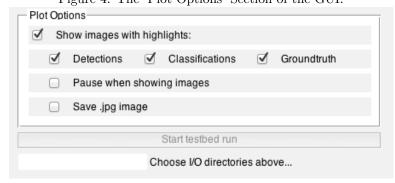
In this section of the GUI, the user can choose which modules are executed during the ATR process via several check boxes and selection menus.

The first check box toggles the manual selection of the detector, feature generator, and classifier modules. When this is enabled, the module listed in a given field will be executed during the ATR process; otherwise, the default algorithms will be used. The GUI will automatically detect all modules within the directory structure that follow the specifications for adding a custom module described in Section 7.

ATR Modules Manual detector/classifier selection HFBB_CCA ***** Detector: Features: Isaacs 4 Classifier: Isaacs Class. Data File: data_JI_SSAM1_default.mat Skip performance estimation Performance Model: ATRTTSP Use contact correlation Algorithm: Cobb

Figure 3: The 'ATR Modules' Section of the GUI.

Figure 4: The 'Plot Options' Section of the GUI.



(Note: For the publicly released version of MATS, the default algorithms (i.e., 'Test') are placeholders that determine results at random. They are intended for illustrative purposes only.)

There is also a selection menu for classifier parameter files. Different parameter files can be created for different classification scenarios as necessary.

The other check boxes toggle the optional performance estimation and the contact correlation algorithms. When either of those are enabled, the module listed in the selection menu will be executed; otherwise, no algorithm of that type will be executed.

4.3 Plotting Options

This section of the GUI customizes the appearance and behavior of the image display window that MATS produces after processing an image.

Testbed Input Parameters Show detailed text messages Save input structure with results Use preprocessed detector results Enable feedback architecture Skip feedback completely Feedback Every contact is confirmed/rejecte. Archive operator feedback

Figure 5: The 'Input parameters' Section of the GUI.

Show Images with Highlights

Enabling this option will display the image after the processing is complete.

Highlight Options

Here there are three check boxes, one each for detections, classifications, and ground truth elements. Each check box, when enabled, will cause a colored box to appear around the items in the image designated by its label. The color blue represents ground truth, green represents detections, and red represents classifications. (Note: If a contact is classified as a target, and both detections and classifications are to be highlighted, only the classification box will be visible. This is because the classification box is placed on top of the detection box.)

Pause While Showing Images

Enabling this option pauses code execution after displaying the image and the selected highlights. MATS will not resume processing until the user clicks on the continue button in the image display window.

Save Images

Enabling this option will save a copy of the image shown, with highlights, into the designated output directory.

4.4 Other Input Parameters

There are several other parameter switches that can be used to modify the behavior of the code:

Show Detailed Text Messages

This option displays more text on the command line and is intended largely for debugging purposes. The amount of text that is displayed without this option enabled is sufficient to monitor the progress of the code's execution.

Save Input Structure With Results

Enabling this option will save the input structure along with the image's contact list and the results from the performance estimation. (Note: This makes the stored output data file large).

Use Preprocessed Results

When this option is enabled, the user will be prompted for a folder containing previous results after starting the run. For each file in the input folder, the corresponding I/O file will be loaded instead of running the input data through the detector. This will significantly decrease the amount of time required to process an image and can be useful when testing classifiers. Enabling this option will also "gray out" GUI fields relating to data input.

Enable Feedback Architecture

Enabling the feedback architecture is not necessary for non-feedback classifiers. Doing so will only execute unnecessary read/write commands that will slow the processing of data. There are two selection submenus that configure the feedback behavior of the testbed:

Feedback Mode: determines how operator feedback is entered into the testbed

- 'Use feedback GUI': uses a GUI to view contact snippets, add contacts, and provide operator feedback. (See Section 6.)
- 'Simulate operator feedback w/ archive': uses a saved file containing operator feedback from a prior run.
- 'Skip feedback completely': no feedback input. This is primarily used in situations where some other program (i.e., an external GUI) will collect the feedback from the user.
- 'Simulate operator feedback w/ ground truth data': uses ground truth information to determine what a hypothetical operator would say. (Note: If you haven't actually selected a ground truth file, this will crash the testbed program.)

Operator mode: determines how a lack of operator feedback is handled by the testbed

• 'Every contact is confirmed/rejected by operator': the operator cannot skip contacts

• 'Interpret no operator comment as implicit agreement': when an operator skips a contact, he agrees with the ATR classification

• 'Use only explicit operator calls': when an operator skips a contact, no feedback will be used.

(Note: Selecting a classifier from the selection menu will automatically change the state of the check box to its proper value; this generally should not be manually overridden by the user.)

Archive Operator Feedback

This option allows for the reuse of operator feedback. When feedback archiving is enabled, the operator feedback will also be written to a text file where it can be reused in a later run.

4.5 Run-time Elements

The bottom-most region of the MATS GUI is composed of a start button, a progress bar, and a message area.

The start button is initially "grayed out" and will remain unclickable until the output directory and, if not using previously obtained results, the data source directory are selected. The remaining items in the GUI will have usable default values.

The main function of the message area is to track the progress of the run along with the progress bar. However, before the run begins, it displays messages to help guide the user toward a complete configuration.

4.6 Menu Options

The preceding sections have described features of the MATS GUI that affect the way the ATR is performed on an image. The GUI has a few other features that do not, and are located in the menu. They are entirely optional but may still benefit the user.

Save/Load Configuration

The GUI allows you to save your run-time configuration for use at a later time via the menu, **Configuration** \rightarrow **Save**. Loading a configuration can be done similarly via Configuration \rightarrow Load. This feature can be used to establish a consistent run-time environment.

Classifier Training

MATS also has mechanisms in place to facilitate classifier training via **Configuration** \rightarrow **Retrain Classifier**. Given the results for a data set, the GUI can extract the features and labels from the data and pass them into a training function, which the classifier developer must provide. (Note: See Section 7.3 for more information about what this entails.)

Figure 6: Excerpt from a sample ground truth analysis.

```
ImageHF-10-7, PORT

C#163 @ ( 400, 301) ------ .....No match.....
x C#164 @ (2401, 650) ------ GT#122 @ (2401, 650)
x C#165 @ (3208,1151) ------ GT#123 @ (3201,1150)
x C#166 @ (2022,1401) ----- GT#124 @ (2001,1400)
......No match.... ------ GT#121 @ (1601, 900)
```

Ground Truth Analysis

Select Analysis \rightarrow Ground Truth Analysis to launch the ground truth comparison tool. Once a folder containing results files (i.e., of the form IO_*.mat) is chosen via the folder selection window, the contacts in that folder will be loaded into memory and its contents will be compared to the selected ground truth file. (Note: A ground truth file must be selected in the GUI in order to use this function.)

The final printout lists all of the contacts' locations from that folder, along with all of the ground truth entries from the designated ground truth file. The data is organized such that each group of text corresponds to one image's worth of data. When a ground truth entry matches a contact, its information will appear in the same line of text as that of the matching contact. Any unmatched ground truth entries will appear at the end of the group corresponding to the image in which it is located. Contacts that were classified as targets are indicated by an X at the beginning of the line. A sample excerpt of this process is shown in Figure 6.

At the end of the printout, all of the ground truth entries from the ground truth file that were not matched with contacts from the ATR are listed, along with some summary statistics. The list of unmatched ground truth entries does not include entries corresponding to data files that were not actually processed.

ROC Curves

Once a run has been completed, a receiver operator characteristic (ROC) curve may be generated by selecting $Analysis \rightarrow ROC$ Curve Analysis $\rightarrow Generate$ ROC Curve from the menu, and choosing the folder where the results files were stored. The ROC_*.mat files will be read in turn, and a ROC curve will be generated using all of the data up until the current file, for each file in the list. This shows how the ROC curve is changing over time as more data has been processed. The ROC curve generated displays averaged probability of classification versus averaged probability of false alarm. (Note: This functionality requires the MATLAB® Statistics Toolbox, the 'perfcurve' function in particular.)

Various runs using different detection and classifier algorithms can be compared by generating ROC curves for each run which looks only at performance against targets. This comparison can be generated by selecting Analysis \rightarrow ROC Curve Analysis \rightarrow ROC Compare from the menu. It will ask the user to

choose the folder where the results files were stored for the first algorithm and then plot the corresponding curve. It will then ask for the results files for the second algorithm and plot the corresponding curve on the same axes. It will continue to ask the users for files and adding curves until 'Cancel' is pressed. In order for correct results the user must select a ground truth file in the main MATS GUI and the proper file format. The ROC curves from this function compare probability of detection / probability of classification versus false alarms per image. The function removes double calls and excessive non-target calls which can falsely boosts an algorithm's performance to accurately compare algorithms.

Confusion Matrix

A confusion matrix can be generated for a chosen folder via **Analysis** \rightarrow **Generate Confusion Matrix**. This will summarize the numbers of correctly identified objects, correctly rejected non-objects, misses, and false alarms and the column sums are targets and non-targets. (Note: This functionality requires the MATLAB® Statistics Toolbox.)

Display Formatted Contact Data

This tool provides a convenient way to display the locations of a list of contacts in an easily legible format. Select **Analysis** \rightarrow **Print Sorted Contact List**, and then one of the remaining options (pixel coordinates or latitude/longitude pairs). When prompted, choose a folder containing results files. The contacts from all of these files will be aggregated into a master contact list, and the contacts' locations will be displayed along with classification and classifier confidence at the MATLAB[®] prompt. The entries will be sorted with decreasing values of classifier confidence (shown as CLASSCONF).

Lat./Long. Ground Truth Converter

A ground truth file containing latitude and longitude coordinates can be converted into a file based on image pixel locations by selecting the $\mathbf{Tools} \to \mathbf{Convert\ lat/long\ GT\ to\ pixel\ GT\ }$ option from the menu. After the user selects the input directory, file format, and ground truth file names, the lat/long coordinates will be translated to estimated pixel coordinates for all images in the input directory. This process may take some time.

After all of the estimated coordinates have been calculated, the user will be asked to confirm or reject the entries via a simple image display GUI. If the user clicks inside the image boundaries, then the coordinates corresponding to the location that the user clicked will be added to the new pixel-based ground truth file; if the user clicks off of the image, that entry will be rejected. Once this process has finished, the new ground truth file may be used in the Configuration GUI. (See Section 4 for more details.)

Documentation

This file may be accessed via MATS by selecting $\mathbf{Help} \to \mathbf{MATS}$ Documentation from the GUI menu.

5 Running MATS

Once the run button is clickable and not "grayed out", MATS is ready to run. Clicking the run button will initiate a loop that will process all of the selected images in turn. As the code runs, status messages will be printed to the MATLAB® prompt. Before each module is run, there will be a message announcing which module is starting. When the module finishes, another message will display the amount of time elapsed within that module. These two sets of messages can help the user monitor the progress of an individual data file through the ATR. The progress bar in the GUI will advance as the files are processed in turn.

When an image has completed processing, the results (and possibly the input structure, if enabled via the GUI) are saved in a file called IO_[INPUT_FNAME].mat where [INPUT_FNAME] is the name of the source data file without its extension. Similarly, a smaller file ROC_[INPUT_FNAME].mat will be created that can be used in the ROC curve feature discussed in Section 4.6.

After all of the selected images have been processed, contact correlation will be run if contact correlation is enabled in the GUI configuration. Finally, if a ground truth file had been entered into the GUI before execution, the ground truth analysis function prints a summary of the final contact list and ground truth information. The ground truth analysis function is also discussed in more detail in Section 4.6.

6 Using the Feedback GUI

Included in MATS v1.1 is a new feedback GUI that combines the functionality of the old feedback GUI and image display functions and also has the capability to add contacts manually in the event that the ATR did not identify them. This GUI is used whenever the Use feedback GUI (series) option is selected in the Configuration GUI. (See Section 4.4 for more information.)

The feedback GUI has three main components. The right section displays the full image with several types of annotations. Detections that are classified as objects are highlighted with a red box; if using a multiclass classifier, the class number is shown above the box. Detections that are not classified as objects are instead highlighted with a green box.

If using past results instead of a detector, the classifier highlight boxes may appear split. A red left half indicates that highlighted contact was classified as an object in the *previous* run; similarly, a red right half indicates that the contact was classified as an object in the *current* run. In the multiclass case, previous and current class labels will appear to the left and right of the contact, respectively.

In all scenarios, if any ground truth objects are present in the image, they are outlined with a blue box.

Any manually added contacts are outlined in magenta. Finally, the current contact is indicated by a white selection marker.

To the left is a smaller image of the HF snippet taken around the current contact. The current contact is either the next contact in the list that is awaiting operator feedback, or the last place that the operator has clicked in the image.

Below the snippet are several buttons that generate and record feedback information. When using binary classifiers, once one of the feedback rating radio buttons has been selected, the selected rating will be recorded after either clicking the Next button (if rating an existing contact) or the Add button (if manually adding a new contact). In the multiclass case, an object type menu is also available; the default value will be for the class that the classifier has chosen, but this can be changed by the user before recording the feedback. After viewing a manually selected snippet, the current contact can be reset to be the next contact in the list that is awaiting feedback by clicking the Revert button.

7 Adding a Custom Module to MATS

The MATS suite has subroutines to automatically import available modules from the testbed directory structure when the GUI initializes. To effectively integrate a new algorithm, files must be created in the proper location so that when the GUI looks for available modules, the new algorithm will be found. The integration process is similar for all module classes, although there are some notable differences which will be covered in the subsequent sections. The next section will detail the integration of a detector.

7.1 Adding a Detector

Image Normalization

A subroutine for image normalization (ATR_Core\normalize_images.m) is included to assist in module development. If this function is called, the .normalizer field of the contact list should be set to 'NSWC'. If a different function is used, a short string identifier should be used instead. If no image normalization is performed, use an empty string (i.e., '').

Copy Code into the Directory Structure

In order for the new module to appear in the appropriate selection menu, it must reside in the proper place in the directory structure. Each module type (e.g., detectors) has a dedicated subdirectory which contains all of the modules of that class, contained in their own subdirectories. In order to access the new module from the GUI, create a new folder (the *module root directory*) of the form [MATS_ROOT]\Detectors\[SUBDIR], where [MATS_ROOT] is the root-level folder of the MATS package (i.e., the folder in which the GUI is located),

and [SUBDIR] is a descriptive string identifying the module. Because this string is part of the path of the module's files, it should be kept fairly short for convenience.

Create the Main Function

In the module root directory, create a file det_[SUBDIR].m. This function is the entry point into the new module. The GUI will search for this file specifically, and execute it when necessary if it is selected in the detector module menu. Note that the file name must include the same spelling, including case, as the subdirectory in which it resides. This file must take in one input (an input structure) and return one output (a contact list). The new detector should only operate on familiar sensor types; if an unrecognized sensor is chosen, it should produce an error to prevent producing potentially misleading results. A detector should also initialize all of the fields in the contact list to default values before returning them. An example of this is shown in the file Detectors\Test\det_Test.m.

Create a Description File

Also in the root directory, create a *description file* named about.txt. Each detector, feature generator, and classifier has a file like this that describes what is required for the successful execution of the module. For an example of how to create this for a detector, refer to Detectors\Test\about.txt. Entry descriptions can be found in Table 9 in Section 7.5. Detectors only require the module_tag field.

The integration is now complete. Run testbed_gui.m and your new detector should automatically be in the Detector drop down menu on the GUI.

7.2 Adding a Feature Extraction Method

Adding a feature extraction method is slightly more complicated in that the description file has more required fields; however, the basic process is the same. In this case, the module root directory should be created in the Features subdirectory, and the main function to be called should be feat_[SUBDIR].m which has one input and one output, both of which are the contact list.

7.3 Adding a Classifier

Similar modifications to the procedure are required for classifier integration. The main function <code>cls_[SUBDIR].m</code> should be created in the new folder <code>[MATS_ROOT] Classifiers [SUBDIR]</code>. The parameters to the function should be the same as for the feature case: one input, one output, both as a contact list. However, since classifiers can be trained on different feature sets, an additional step is required to accommodate this.

Classifier Parameter Files

At least one classifier parameter file must also be created. Each of these files should contain a version of all the configurable parameters that could vary among parameter files. There are no constraints placed on the internal organization of this file; MATS will only pass the file name selected from the GUI selection menu entitled 'Class. data file' into the classifier upon execution. (Refer to Section 4.2 for more information about the GUI). The default data file should be indicated with default in the file name somewhere.

Training Functions

In addition, a classifier may also have a training function to assist in creating the classifier parameter files. The training function should have a function definition of the form $trn_[SUBDIR]$ (labels, features, data_fname), where labels is a $1 \times N$ row vector containing ground truth information for N contacts, features is an $L \times N$ matrix containing the feature vectors of these contacts as columns, and data_fname is the name that the new classifier data file will have. labels and features will be extracted from prior results (i.e., the 10_* .mat files from a prior run).

7.4 Adding Other Modules

To integrate performance estimation and contact correlation algorithms, follow the procedure outlined in Section 7.1 with the changes listed in Table 8 . A description file is not required for either of these module classes.

7.5 Summary

For any module, a new subdirectory (the module root directory) must be created within the proper folder for its module class. All of the module's code must be copied into the module root directory. In addition, a main function with the appropriate prefix must be created in order for the GUI to recognize the new module as a valid choice. Furthermore, each detector, feature generator, and classifier has a description file called about.txt located in its root directory. This file describes what is required for the successful execution of the module in the manner shown in Figure 7. The GUI parses this file, extracts the necessary information from it, and modifies the run-time configuration appropriately. All of these options are summarized in Table 8 and Table 9. (Note: For the binary flags in Table 9, either 1/0 or 'yes'/'no' will be properly interpreted by the GUI.)

Figure 7: Sample Description File.

module_name: Test Classifier

module_tag: TEST
uses_feedback: 0

Table 8: Summary of Integration Parameters.

Class	Subdirectory	Prefix	Need DF?
Detector	Detectors\	det_	X
Feature Ext.	Features\	feat_	X
Method			
Classifier	Classifiers\	cls_	X
Performance	Performance_Estimation\	perf_	
estimation			
Contact cor-	Contact _□ Correlation\	cor_	
relation			

Table 9: Required Entries in Description Files.

Det.	Feat.	Class.	Description File Entry
X	X	X	module_name: character string indicating the name of the module.
X	X	X	module_tag: short character string (3-4 alphanumeric characters)
			that will appear in the corresponding module identifier strings (e.g.,
			.detector).
	X		reqs_inv_img: binary flag indicating whether this feature extrac-
			tion method requires inverse imaging.
	X		reqs_bg_snippet: binary flag indicating whether this feature ex-
			traction method requires background snippets.
	X		feat_mode: string indicating how features are handled. 'append'
			adds onto the existing features, if any were created by the detector;
			'overwrite' overwrites them.
		X	uses_feedback: binary flag indicating whether this classifier can
			use operator feedback.
		X	multiclass: binary flag indicating whether this classifier can dis-
			tinguish among object types (1) or only between object and non-
			object (0).

7.6 Feedback

If the classifier to be added to the testbed has a feedback element (i.e., it requests data from the user/operator in order to improve its performance), additional steps must be taken to ensure successful execution. In this scenario, it is assumed that an operator process is running in parallel, so that the operator and ATR processes do not have to wait on each other.

The classifier can query the operator via the .opfeedback.opdisplay fields of the contacts in the contact list. By setting these to a positive value the classifier can indicate that the operator should confirm or reject a given target. In response, the operator rates the contacts in turn on a five-point scale, with a value of five corresponding to a confident target classification; three, an ambiguous case; and one, a confident non-target classification. These ratings are stored in opfeedback.opconf.

Once the operator has rated a contact, this information needs to be relayed back to the testbed where it can inform the classifier. Since the testbed is already busy processing the next image at this point, this communication must happen indirectly. The operator decisions are written to a dedicated *feedback file*, the contents of which will be read during the next iteration of the ATR processing. The information contained in the feedback file will be incorporated into the contact list, and then the feedback file will be cleared of any data.

A classifier should never attempt to reclassify a contact that has been viewed by the operator. After the operator has evaluated an image worth of contacts, it is assumed that he has made any necessary corrections to erroneous calls. The last contact that the operator has viewed can be easily determined by finding the latest negative value for .opdisplay.

8 Frequently Asked Questions

1. I see messages saying that 'bkuplock.txt' and/or 'bkupedit.txt' cannot be opened. Is that bad? Probably not. At the beginning of the run, bkuplock.txt and bkupedit.txt will not exist. bkuplock.txt will not be written to until an operator feedback action takes place. If you haven't submitted feedback on any contacts yet, messages indicating that those files do not exist or cannot be opened are expected. Appendices

A Communication Between ATR and Operator Modules

In order to successfully integrate a feedback classifier, some additional details about the inner workings of the MATS code must be understood. Otherwise, unexpected behavior may result, and the causes may be difficult to identify.

The mechanism by which the feedback is acquired from the operator is called the *operator process* and runs in parallel with the main ATR process. The two processes must communicate with each other via common files. The operator process can check periodically for new output files (i.e., new IO_*.mat files located in the output directory) to get information about new contacts that have been recently created by the ATR process. After obtaining the operator's feedback on the new contacts, the operator process should record the feedback in order to pass it on to the classifier. This can be done in one of two ways: 1.) by running a MATLAB® function to edit the saved contact lists directly (Section A.1), or 2.) by appending the feedback data to the feedback file (Section A.2).

The cumulative contact list is saved across two files. The *locked file* contains all of the contacts for which the operator has given feedback, or has had the opportunity to give feedback but has declined to do so. The remaining contacts are stored in the *unlocked file*. Thus the unlocked file contains new contacts as well as backlogged contacts that the operator has not yet seen. At the end of the ATR function, newly evaluated contacts (as determined by changes in their .opfeedback.opconf values) migrate to the locked file, and the unlocked file is updated to both reflect this movement and to include new contacts from the current image.

Internally, the main ATR function tracks two indices that determine how a contact's data may be modified. The *last locked index* is the index of the last contact residing in the locked file. This index can be found by locating the last contact with a non-negative .opfeedback.opconf value towards the beginning of the contact list. Because normally data is only appended to the locked file, any further changes to the contacts stored in the locked file will not be recognized by the ATR; instead, the ATR will continue to read the version that was previously written in the locked file.

The last viewed index is the index of the last contact that the operator has had the opportunity to see. What this means depends on how the feedback is acquired. If the contacts are presented sequentially, then the last viewed index corresponds to the index of the last contact presented. If the operator sees all of the contacts from one image at a time, then this would be the latest index of the contacts on the screen, regardless if the operator has really examined or commented on that contact. The contact at the last viewed index is the last contact with a negative value of .opfeedback.opdisplay towards the front of the list. (Alternatively, it is the contact before the earliest one with a non-negative value of .opfeedback.opdisplay.) When the ATR runs, any contact that has not been viewed will be passed into the classifier for classification.

Figure 8 illustrates these concepts for a sample contact list. In this scenario, all contacts from the same image are viewed simultaneously. Each column in the array represents a contact, and each row represents an operator feedback field (i.e., .opdisplay or .opconf). The contents of each cell indicates the sign of the

feedback field listed on its row for that contact. In this example, contacts(2).opfeedback.opconf is zero, and contacts(2).opfeedback.opdisplay is negative. The locked contacts are shaded red; the unlocked contacts are shaded either white or blue. The blue contacts represent contacts from future images that have already been processed by the ATR, but have not been viewed by the operator, and are hence able to be reclassified. The white contacts are currently on the operator's screen. Note that if the contacts were being evaluated sequentially, the white region would consist of at most one contact. The last locked index and last viewed index are the indices of the last contact in the red and white regions, respectively. By modfying the operator feedback fields, these indices advance and the contacts' data becomes more protected.

A.1 Option #1: Modifying the Contact List with Subroutines

The simplest way to communicate the operator feedback to the ATR process is to call several MATLAB[®] subroutines located in the ATR_Core subdirectory of the MATS library. This method will edit the saved contact lists directly.

- 1. Read value of contacts(k).opfeedback.opdisplay. If this value is positive, then feedback is requested for this contact. (Note: Refer to Table 6 for more information.)
- 2. Query the operator to acquire feedback (i.e., contacts(k).opfeedback.opconf). MATS currently supports a five-point scale, with a five likely being a target and a one likely being clutter.
- 3. Wait while the file bkup_atr_busy.flag exists using the wait_if_flag function. When bkup_atr_busy.flag is present, the ATR process is busy modifying the locked and unlocked files.
- 4. Create bkup_gui_busy.flag with the write_flag function. Similarly, the presence of bkup_gui_busy.flag informs the ATR process that the operator is about to change the contents of the locked file and/or the unlocked file. The ATR process will then wait until the contact list files are again available before trying to access them.
- 5. Check if any new contacts are available by searching for new IO files in the output directory. A new file in the directory indicates that the contact list may have been changed.

6. If new contacts are available, load the latest version of the contact list using the read_backup function.

- 7. Edit the contact list to incorporate operator confidence (.opconf).
- 8. Save contact list via the write_backups function.
- 9. Delete bkup_gui_busy.flag with delete_flag. Failure to delete bkup_gui_busy.flag will cause the ATR to hang indefinitely!

Notes:

- When a contact is viewed, 10 should be subtracted from its .opfeedback.opdisplay value, and the saved lists should be updated using Steps 3-9. This will prevent contacts that are currently being viewed from being reclassified.
- Details of the functions mentioned above can be found in Appendix B.
- The ATR process stores the locked contacts in [TB_ROOT]\bkuplock.txt and the unlocked contacts in [TB_ROOT]\bkupedit.txt. Use these values when calling read_backups or write_backups.

A.2 Option #2: Appending to the Feedback File

An alternative approach is to write the feedback to the feedback file. During each execution of the ATR, all contents of the feedback file are read, incorporated into the contact list, and finally purged from the feedback file. Thus, the feedback file contains all of the operator feedback that has accumulated since the last time the ATR checked that file.

Writing to this file involves low-level writing operations and requires the writing operations to perfectly match future read operations, whereas Option #1 handles this automatically behind the scenes. However, the benefit of this approach is that it does not require any particular programming language in order to work.

The process for effectively relaying feedback for the kth contact to the ATR process via the feedback file may be summarized as follows:

- 1. Read value of contacts(k).opfeedback.opdisplay. If this value is positive, then feedback is requested for this contact. (Note: Refer to Table 6 for more information.)
- 2. Query the operator to acquire feedback (i.e., contacts(k).opfeedback.opconf). MATS currently supports a five-point scale, with a five likely being a target and a one likely being clutter.
- 3. Wait while the file opfb_atr_busy.flag exists using the wait_if_flag function. When opfb_atr_busy.flag is present, the ATR process is busy modifying the contents of the feedback file.

4. Create opfb_op_busy.flag with the write_flag function. Similarly, the presence of opfb_op_busy.flag informs the ATR process that the operator is about to change the contents of the feedback file and will cause it to wait until the feedback file is again available.

- 5. Append operator confidence data to feedback file feedback.txt in the proper format. This is detailed in the next section.
- 6. (Optional) Increment counter stored in feedback_cnt.txt. This is only necessary if periodic updating of the classifier is desired. The ATR will reset this value automatically after incorporating feedback from the feedback file file into the list.
- 7. Delete opfb_op_busy.flag with delete_flag. Failure to remove opfb_op_busy.flag will cause the ATR to hang indefinitely!
- 8. (Optional) Periodically update the classifier.

Appending Data to the Feedback File

In order to properly relay the operator feedback to the classifier, data must be appended to the feedback file in the proper format. The amount of data to be appended depends on what kind of action the operator has taken. In the case of a *verify operation*, where the operator rates an existing contact, not much information is needed because an entry for this object already exists in the contact list. However, for *add operations*, when the operator manually adds a contact to the contact list that the ATR did not detect, additional data is required to fill in the data fields that would have been filled by the ATR. The following data for an arbitrary contact (add or verify) are always written in this order:

- ID (uint16) unique identifier for each contact in the contact list. Starts at 1 and increments with each new contact added to the list.
- est_index (uint16) For verify case: current index at the time of review; in most cases, this is the index, but in the event of a manual contact insertion, this contact may have shifted to a later position.

 For add case: index of insertion into the array
- type (uchar) either 'V' (verify contact) or 'A' (add contact manually)
- len_fname (uint8) length of filename
- filename (1 x len_fname, uchar) name of the file in which this contact is located
- side (1 x 4, uchar) either 'PORT' or 'STBD'
- len_sensor (uint8) length of sensor name

- sensor (1 x len_sensor, uchar) name of sensor used (e.g., 'ONR SSAM')
- x (uint16) x location of contact (in pixels)
- y (uint16) y location of contact (in pixels)
- opdisplay (int8) new value of opdisplay. Values are shifted by -10 to indicate that this contact has been viewed by the operator (i.e., contacts(index).opfeedback.opdisplay 10).
- opconf (int8) operator confidence rating (1-5)

In addition, these fields must be written when adding contacts:

- hf_rows (uint16) number of rows in high frequency snippet
- hf_cols (uint16) number of columns in high frequency snippet
- hf_reals (hf_rows x hf_cols, float32) real part of complex HF snippet
- hf_imags (hf_rows x hf_cols, float32) imaginary part of complex HF snippet
- bb_rows (uint16) number of rows in broadband snippet
- bb_cols (uint16) number of columns in broadband snippet
- bb_reals (bb_rows x bb_cols, float32) real part of complex BB snippet
- bb_imags (bb_rows x bb_cols, float32) imaginary part of complex BB snippet
- lf1_rows (uint16) number of rows in LF1 snippet
- lf1_cols (uint16) number of columns in LF1 snippet
- lf1_reals (lf1_rows x lf1_cols, float32) real part of complex LF1 snippet
- lf1_imags (lf1_rows x lf1_cols, float32) imaginary part of complex LF1 snippet
- lat (float32) latitude of added contact
- long (float32) longitude of added contact
- heading (float32) heading of added contact
- time (float32) time stamp of added contact
- altitude (float32) altitude of added contact
- hf_ares (float32) along-track resolution of original HF image

- hf_cres (float32) cross-track/range resolution of original HF image
- hf_anum (uint16) along-track size of original HF image
- hf_cnum (uint16) cross-track/range size of original HF image
- bb_ares (float32) along-track resolution of original BB image
- bb_cres (float32) cross-track/range resolution of original BB image
- bb_anum (uint16) along-track size of original BB image
- bb_cnum (uint16) cross-track/range size of original BB image
- lf1_ares (float32) along-track resolution of original LF1 image
- lf1_cres (float32) cross-track/range resolution of original LF1 image
- lf1_anum (uint16) along-track size of original LF1 image
- lf1_cnum (uint16) cross-track/range size of original LF1 image
- len_vlats (uint16) length of vehicle latitude data
- veh_lats (len_vlats x 1, float32) vehicle latitude data
- len_vlongs (uint16) length of vehicle longitude data
- veh_longs (len_vlongs x 1, float32) vehicle longitude data
- len_vheights (uint16) length of vehicle height data
- veh_heights (len_vheights x 1, float32) vehicle height data
- len_normalizer (uint8) length of normalizer ID string
- normalizer (uchar) normalizer ID string

B Notable Functions

$testbed_gui$

function testbed_gui() - Main function for the MATS GUI. No inputs or outputs.

B.1 Detector Subroutines

detsub_contact_fill

function [contacts, ecd_vec] = detsub_contact_fill(contacts, ecd_vec, k, input_struct) - Fills in many contact fields of contacts(k) with default values or values coming directly from the input structure.

- contacts = contact list (See Table 5)
- ecd_vec = extra contact data list (previously included in contact list) (See Table 7)
- k = index in contact list
- input_struct = input structure (See Table 1)

detsub_gt

function contacts = detsub_gt(contacts, input_struct) - Incorporates the ground truth data from an input structure into the contact list. (Note: This function assumes that all of the contacts in contacts are in the image represented by input_struct.)

- contacts = contact list (See Table 5)
- input_struct = input structure (See Table 1)

B.2 External Feedback Reference

wait_if_flag

function wait_if_flag(flagname) - Causes execution to wait while the file(s) defined in flagname exist.

• flagname = either a string representing the filename of the flag to wait for, or a cell array containing multiple such strings.

write_flag

function write_flag(filename, msg_on) – Writes a tiny, empty file whose sole purpose is merely to exist. This is used to inform processes of which files are currently being used.

- filename = the name of the file to be created.
- $msg_on = 0$ or 1, enables debugging messages.

delete_flag

function delete_flag(filename, msg_on) - Deletes a flag file.

- filename = the name of the file to be deleted.
- $msg_on = 0$ or 1, enables debugging messages.

read_backups

function c_list = read_backups(fn_1, fn_u, msg_on) - Reads the backup files specified in fn_1 and fn_u and imports the data into a contact list.

- fn_1 = file name of the backup file used to store unchangeable (locked) contacts.
- fn_u = file name of the backup file used to store contacts that can still be changed (unlocked).
- $msg_on = 0$ or 1, enables debugging messages.
- c_list = a contact list containing all of the data contained in the input.

$write_backups$

function write_backups(c_list, lock_ind_old, lock_ind_new, fn_l, fn_u, msg_on) — Writes the contact list (c_list) over two files: fn_l, for past contacts that cannot be changed again, and fn_u, for more recent contacts that may be reclassified again.

Normally, the locked list is only appended to since, by definition, the contacts within the locked list cannot change. However, it may be desirable to manually remove a contact that causes problems for the ATR, which would also require removing it from the locked backup. In this case, call this function with lock_ind_old == 0. This will mimic the first call to this function and overwrite the locked backup with all contacts with indices up to and including lock_ind_new.

- c_list = a contact list.
- lock_ind_old = index of last locked contact from previous call to write_backups.
- lock_ind_new = index of last locked contact from current call to write_backups.
- fn_1 = file name of the backup file used to store locked contacts.
- fn_u = file name of the backup file used to store contacts that can still be updated.
- $msg_on = 0$ or 1, enables debugging messages.

$find_last_locked$

function lastlock_index = find_last_locked(contacts, show_details) - Determines the last contact to evaluated by the operator by scanning the .opconf values.

- contacts = a contact list
- show_details = 0 or 1, enables debugging messages.
- lastlock_index = index of the last contact to be evaluated by the operator

$find_last_viewed$

function lastview_index = find_last_viewed(contacts, new_img_ind, show_details) - Determines the last contact to be seen by the operator by scanning the .opdisplay values.

- contacts = a contact list.
- new_img_ind = first index of current image; search will start at the contact before this location.
- show_details = 0 or 1, enables debugging messages.
- lastview_index = index of the last contact that was seen by the operator

C Version History

C.1 Version 1.1

Significant Changes

• Split contact structure into three structures: contacts, extra contact data (ecdata), and optional field data (ofdata). Most contact-related data is now stored to disk after completing ATR processing for an image. Further information about the contacts and ecdata structures can be found in Table 5 and Table 7, respectively.

- Added new feedback GUI (roughly a combination of the opfeedback_stub and general_display functions)
- Added latitude/longitude to pixel coordinate ground truth converter (accessed via main GUI menu)
- Saved optional field data to ecd folder instead of being discarded (for training purposes)
- Single-band detectors have separate about files for each band
- Added support for multiclass classifiers

 $Added\ contacts. type,\ contact. opfeedback. type\ and\ input. g timage. type\ fields\ for\ multiclass\ labels$

Added sample multiclass classifier (Test_multi)

Added multiclass adaptations for image viewer

- Added split-box highlights for image viewer when using past results; displays both past and current classifications to compare performance.
- Changed fields required to be added to feedback file when adding contact:

Deleted optional fields: bg_snippet, hfraw, bbraw, lb1raw, hfac, bbac, lb1ac

Added LF1-related fields: lf1snippet, lf1_ares, lf1_cres, lf1_anum, lf1_cnum

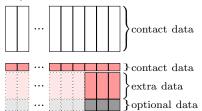
• Updated documentation

Notes Regarding Data Structure Changes

As of version 1.1, the data that originally composed the contact list is now distributed across three variables in order to decrease the cumulative memory usage that occurs while running a feedback classifier. These variables can be summarized as follows:

Essential data – the key fields that are required for later feedback-related operations. This includes
pixel location data, features, feedback information, and classifier outputs. This data will persist in
memory as in previous versions.

Figure 9: Contact Data Structures



- Optional data the fields that are only present if certain optional processing modules are enabled.
 This data will be saved to disk after an image's processing has concluded.
- Extra data everything else. This includes image snippets, resolutions, location information, vehicle information, and anything else that could be relegated to this structure. This data will be saved to disk after an image's processing has concluded.

Figure 9 approximately illustrates how the data has been reorganized in this new paradigm. Now, all three of the variables are present in memory only for the most recent image's worth of contacts; for the earlier contacts, the extra data and optional data are stored in separate files. The dotted region represents the amount of memory that has been freed as a result of the transition. Note that for large contact lists, this is a substantial reduction.

Figure 10 details how these variables move through the ATR stream. The detector (shown in blue) operates on the data in the provided input structure and returns two variables: 1.) a contact list for that image, and 2.) an array of the structures containing extra contact data². This latter structure contains other descriptive data that were originally also included in the contact list. However, this information has been moved to a separate variable so that it may be saved to disk when not in use.

Depending on the run-time configuration provided by the GUI, both the contact list and the extra contact data structures may be sent to optional processing modules (gray) before entering the feature generation (brown) stage of the processing. The results from these optional modules will be stored in a third array of structures. The feature module takes information from all three structures and populates the data fields in both the contact list and the extra contact data array that are associated with a feature module (e.g., contacts(k).features).

At this point the paths of the three arrays diverge. The elements of the extra contact data array are saved in individual binary files with an .ecd file extension, with each file corresponding to all of the extra contact data for a given contact. The names of these files are stored in the .ecdata_fn fields of the contact list. Similarly, the optional data are stored in individual .mat-format files; these will have the same name as .ecdata_fn except with a .ofd file extension. The contact list is processed by the classifier (red) and is

 $^{^2\}mathrm{See}$ Tables 5 and $\,7$ for more information on these data structures.

extra data files

optional data
structure

optional data

optional data

load
save

contacts,

Figure 10: New Data Structures Used During ATR

saved to disk over two files: the locked and unlocked files, which are described in more detail in Appendix A. The contact list is also ultimately returned to the function that called the ATR modules.

C.2 Version 1.0

Initial public release