

Software Development with MATLAB

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What are your software development concerns?

- Accuracy
- Software Speed
- Development Time
- Cost
- Compatibility
- Documentation
- Reusability
- Effective Testing
- Integration

- Ease of Collaboration
- Legacy Code
- Liability
- Maintainability
- Model Risk
- Robustness
- Developer Expertise
- Software Stack Complexity
- ...?

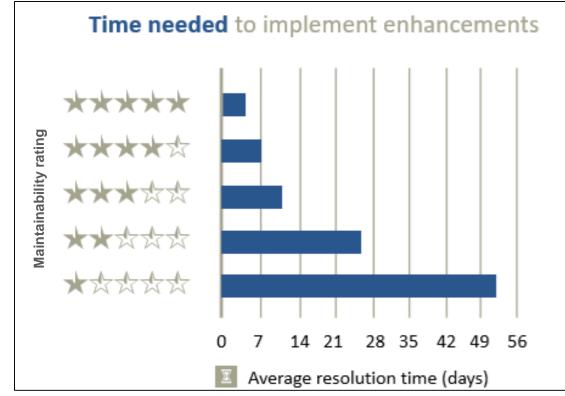


Software development practices can help

Treat your software like an asset \rightarrow reuse it

Developers often spend 4X the effort to maintain vs build software

...but this doesn't need to be true!

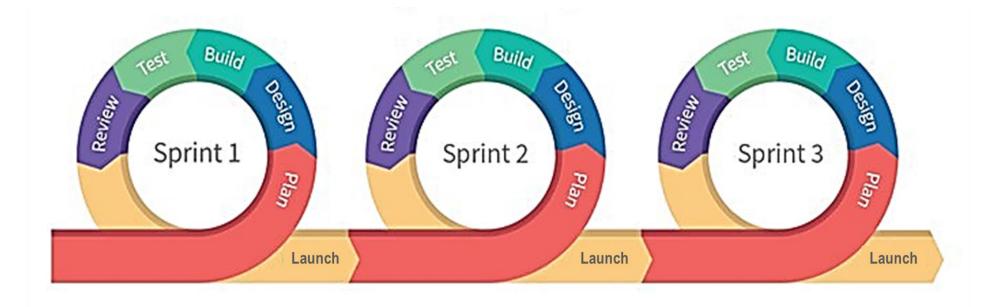


Journal paper: "Faster issue resolution with higher technical quality of software", Software Quality Journal, 201100



Software development practices can help

- Software development approaches like Agile help improve code quality
- The tools and practices we discuss today support Agile development





Agenda

Managing your code
Tracking code changes and co-authoring workflows
Writing better, robust, and portable code
Testing and maintaining your code
Summary



How do you currently manage your files and paths?

- One big folder of files?
- Many folders of files?
- Organize your code in packages?
- Manual path management?



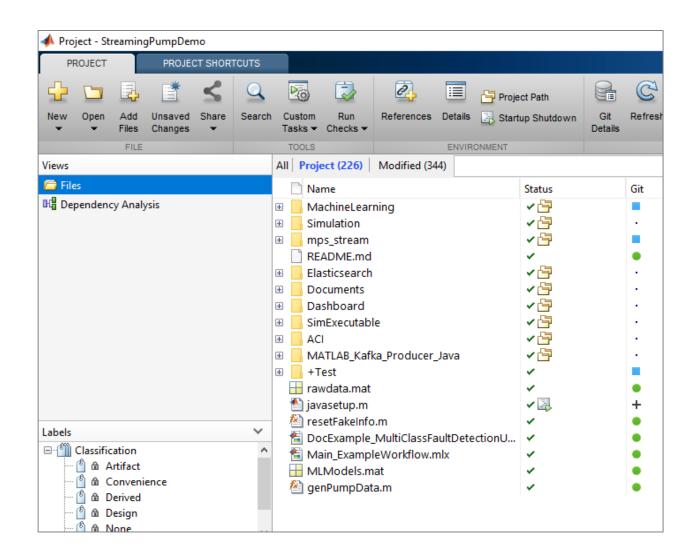
Successful collaborative development requires ...

- Same source code, tests, documentation, requirements, compiler...
- Consistent, shared environment
- Integration with source control



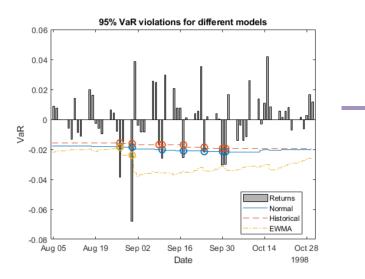
Projects (MATLAB Projects)

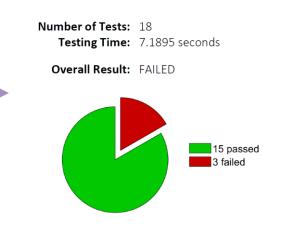
- Manage your files and path
- Analyze file dependencies
- Function refactoring
- Run startup & shutdown tasks
- Create project shortcuts
- Label and filter files
- Integrate source control

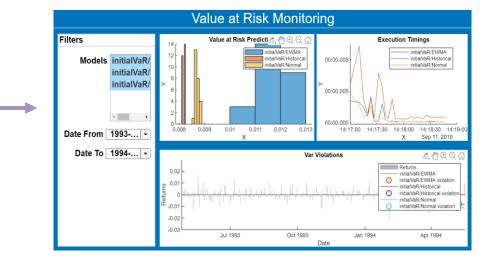




Example: Building a Value at Risk Model on a Portfolio







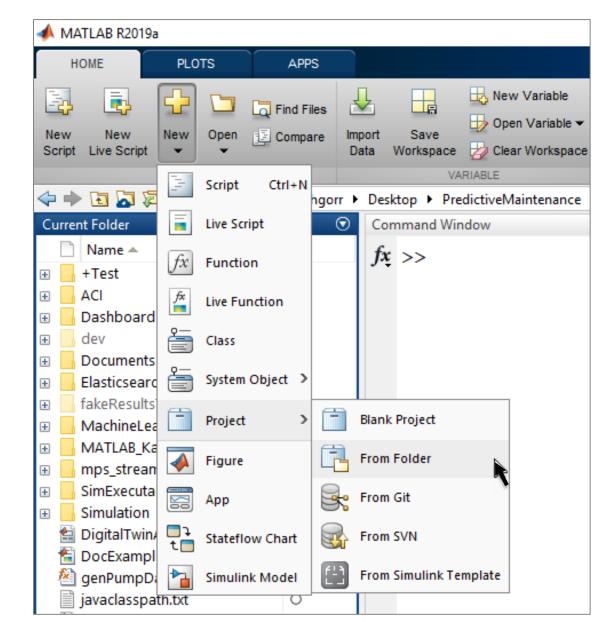
Prototype VaR Model

Refactor and Test Code

Continuous Integration and Deployment



1. Create project



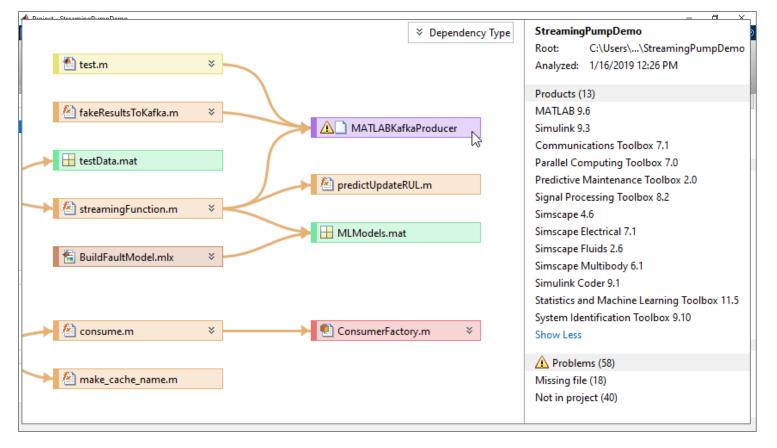


- 1. Create project
- 2. Set path and startup tasks

Se	Set Up Project (Step 2 of 2)	×	×
Sj oj	Specify project files to automate startup tasks. Startup files automatically run (.m and .p files), load (.mat files), and open (Simulink models) when you open the project. Startup files:		_
	Simulation\pump_setup.m		-
	Add Remove Shutdown files:		
	Add Remove		
	Start Simulink before this project starts Refresh Simulink customizations		
	Back Finish	2	



- 1. Create project
- 2. Set path and startup tasks
- 3. Explore dependencies





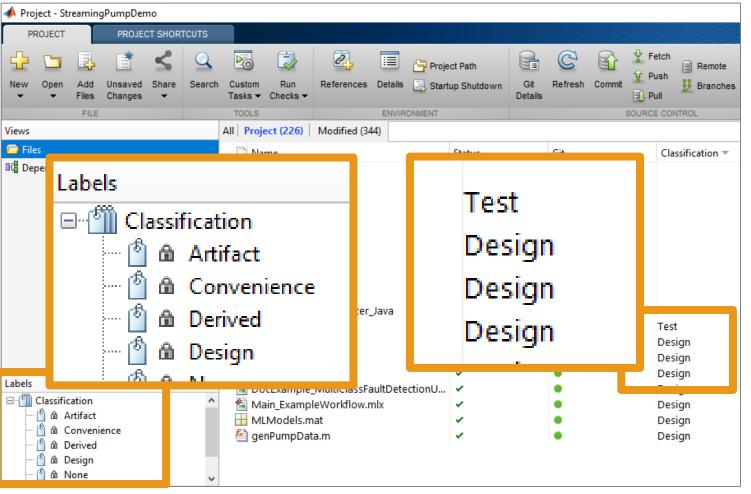
- 1. Create project
- 2. Set path and startup tasks
- 3. Explore dependencies
- 4. Label files



Identify and run tests ...on Continuous Integration (CI) servers

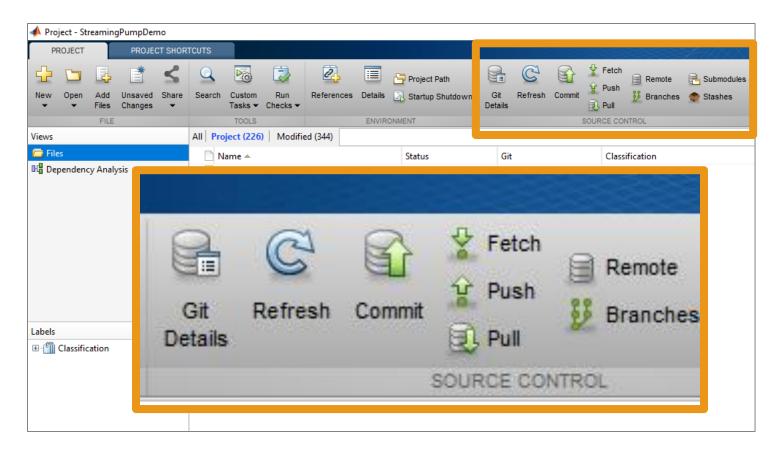


- 1. Create project
- 2. Set path and startup tasks
- 3. Explore dependencies
- 4. Label files





- 1. Create project
- 2. Set path and startup tasks
- 3. Explore dependencies
- 4. Label files
- 5. Integrate source control





Agenda

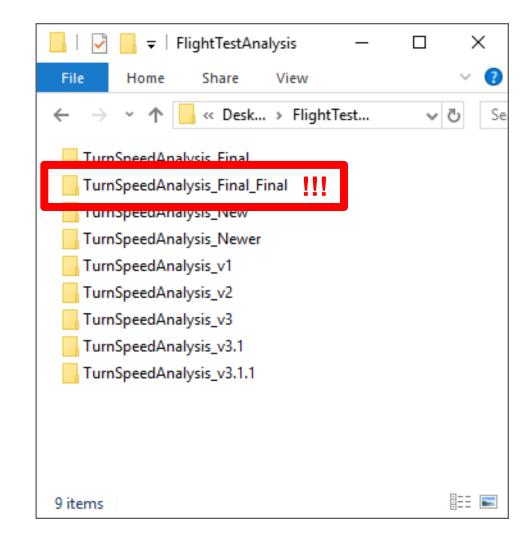
Managing your code
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Writing better, robust, and portable code
Testing and maintaining your code
Summary



How do you keep track of and share your code as it changes?

- Do you:
 - make copies of your code?
 - e-mail yourself copies of your code?
 - keep a spreadsheet of changes?
- Or do you not keep track of your changes?

There's a better way!



A MathWorks

Source Control

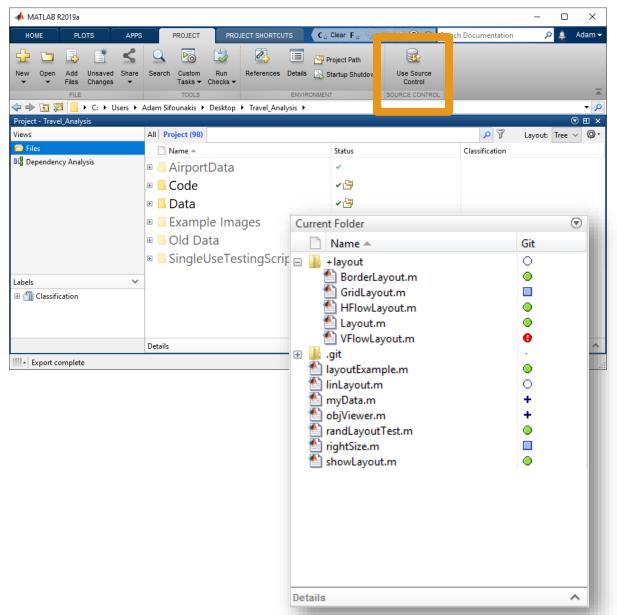
- A system to manage changes to code, documents, etc.
- Benefits of source control:
 - Maintain backups, history, and ability to restore
 - Track changes and responsibility
 - Simplify reconciling conflicting changes
 - Generate discussion
 - Save you from yourself

Current Branch Name: master HEAD: 48eb7581915372974ab7d9cd27e4b9d4348950af Fanch Browser Branches: master	Branches		×
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Source Control integration

- Manage your code from within the MATLAB Desktop
- Git integrated into:
 - Projects
 - Current Folder browser
- Use Comparison Tool to view and merge changes between revisions





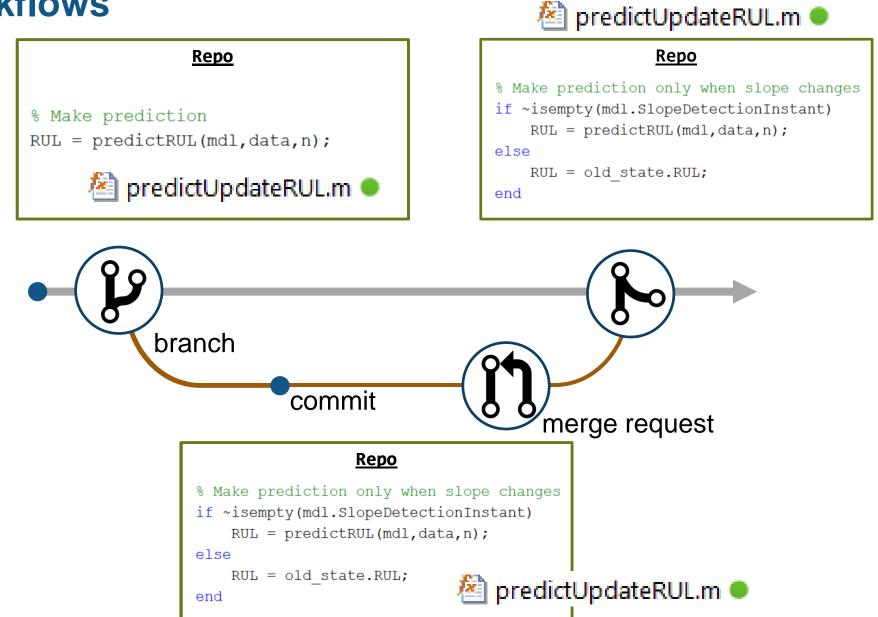
Co-authoring workflows

Creating a repo:

- Initialize
- Add
- Clone

Making changes:

- Commit
- Push
- Branch
- Merge





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Testing and maintaining your code
Summary



What defines "better" code?

- Better organized?
- Smaller?
- Faster?
- More stable?
- More portable?
- Easier to maintain?



Considerations when writing better, robust, and portable code

- Input validation
- Error handling
- Writing faster code using the MATLAB Profiler
- Writing code faster using the Live Editor
- Refactoring code to reduce complexity
- Writing code that works on all operating systems
- Sharing your code via apps, toolboxes, and deployment
- Integrating with other languages
- And more...



Writing more robust code

>> y = myfunc(1:5)

Index exceeds matrix dimensions.

Error in mypkgl.mypkgla.mypkglab.myfunc1 (line 9)
y(idx) = u(idx)*log(u_hat(idx))+(1-u(idx))*log(1-u_hat(idx));

Error in mypkg2.mypkg2a.myfunc2 (line 5)
y = mypkg1.mypkg1a.mypkg1ab.myfunc1(myVar1 .* myVar2);

Error in mypkg3.mypkg3a.myfunc3>@(x)mypkg2.mypkg2a.myfunc2(x) (line 4)
y = arrayfun(@(x) mypkg2.mypkg2a.myfunc2(x), myVar);

Error in mypkg3.mypkg3a.myfunc3 (line 4)
y = arrayfun(@(x) mypkg2.mypkg2a.myfunc2(x), myVar);

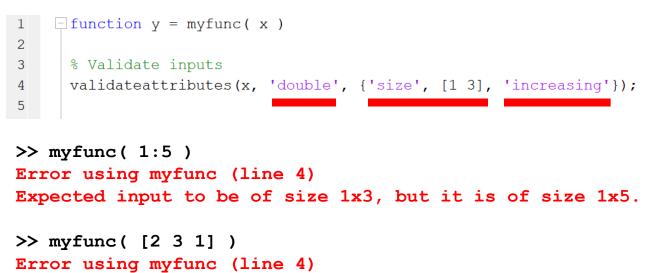
```
Error in <u>myfunc</u> (line 10)
```





Writing more robust code – Validating inputs

- validateattributes
- assert
- isempty, isnan, isfinite, ...
- narginchk
- inputParser
- Property validation for classes



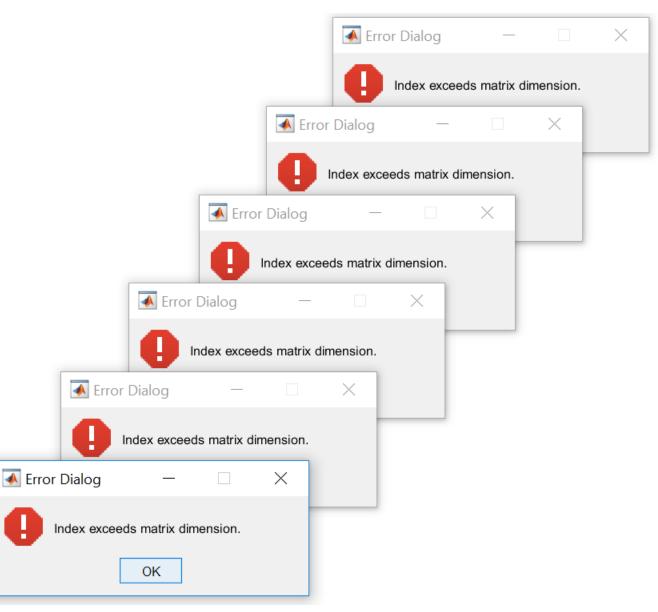
```
Expected input to be increasing valued.
```

```
classdef ValidatorFunction
    properties
        Data(:,1) double {mustBePositive, mustBeFinite} = [1 2 3]
        Interp {mustBeMember(Interp,{'linear','spline'})} = 'linear'
    end
end
```



Writing more robust code – Handling errors more elegantly

- error and warning
 - Use identifiers
- try/catch
- MException
- errordlg and warndlg





Writing faster code – MATLAB Profiler

- Total number of function calls
- Time per function call
- Highlights largest code bottlenecks
- Statement coverage of code

0
Run and Time

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Start Profiling Run this code:				
Profile Summary				
enerated 31-Aug-2015 15:28:51 using pe	rformance ti	me.		
Function Name	<u>Calls</u>	<u>Total Time</u>	Self Time*	Total Time Plot (dark band = self time)
<u>estFit</u>	1	6.525 s	3.591 s	
dswrite	10	1.964 s	0.024 s	
(Iswrite>ExecuteWrite	10	1.919 s	0.394 s	
ofun\private\openExcelWorkbook	10	0.894 s	0.720 s	
onCleanup>onCleanup.delete	10	0.583 s	0.001 s	
(Iswrite>@()xIsCleanup(Excel.file)	10	0.582 s	0.002 s	
ofun\private\xIsCleanup	10	0.580 s	0.579 s	
close	1	0.477 s	0.005 s	
close>request_close	1	0.440 s	0.026 s	
closereq	10	0.390 s	0.376 s	
subplot	20	0.163 s	0.090 s	1
itle	20	0 100 -	0.101 -	1



Writing code faster – Programming aids in the Live Editor

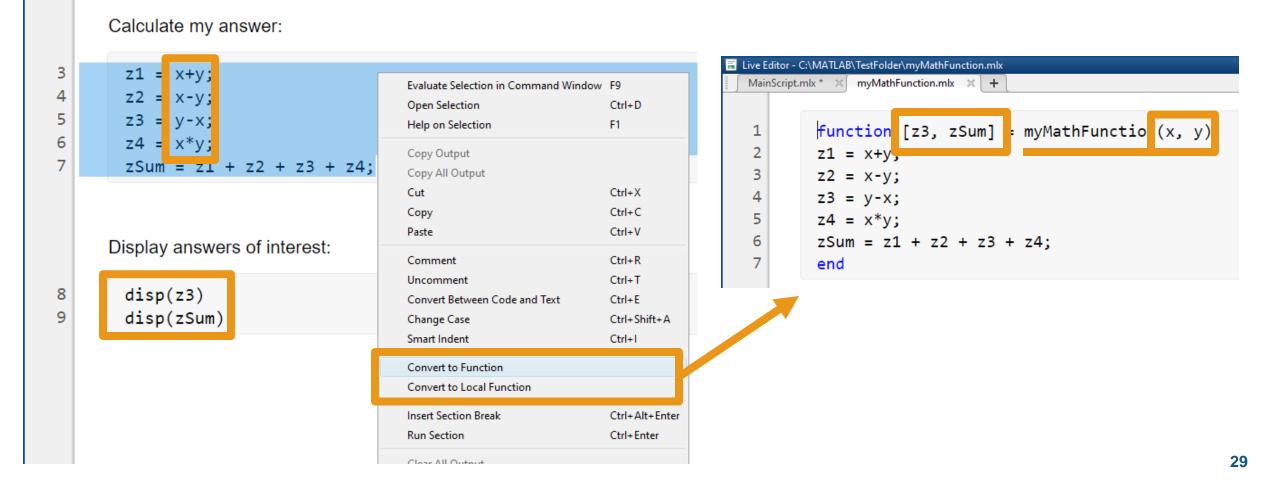
- Automatically closed parentheses, loops, and conditional blocks
- Context-aware coding guides
 - Automatically suggest function names variables, or file names
 - List available Name/Value pairs

Live Editor - C:\MATLAB\timerTest.mlx * — — ×									×			
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Writing code faster – Quickly and safely refactoring code

• Live Editor shortcuts to refactor blocks of code into functions





Writing code faster – Quickly and safely refactoring code

 Function refactoring across files in Projects

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Simple code quality and complexity assessment – checkcode

Analyze all warnings and errors in a code

>> checkcode standardizeEmployeeInfo

L 13 (C 14-24): The value assigned here to 'maxDatetime' appears to be unused. Consider replacing it by ~. L 80 (C 1-27): The value assigned to variable 'emailsInUsernameFormatParts' might be unused. L 116 (C 1-17): The value assigned to variable 'validEmployeeData' might be unused. L 118 (C 1-28): The value assigned to variable 'emailsInFirstLastFormatParts' might be unused.

McCabe Cyclomatic Complexity

- Measures complexity based on the number of linearly independent paths through a code

>> checkcode -cyc standardizeEmployeeInfo

L 1 (C 14-36): The McCabe cyclomatic complexity of 'standardizeEmployeeInfo' is 13.

Writing more portable code – Code that runs everywhere

- Operating System-aware code
 - fullfile
 - ispc, ismac, isunix
- More reliable portability with Projects
 - Consistent path management
 - Automated startup/shutdown procedures
 - Built-in file dependency analysis

>>	fullfile	""	,"data"	,"2019"	,"April")
----	----------	----	---------	---------	-----------

Windows:	"\data\2019\April"
Mac/Linux:	"/data/2019/April"

Set Up Project (Step 1 of 2) Specify folders to add to the pr open the project, and removed	oject path. These folders are added to the MATLAB search path when you when you
 MachineLearning MATLAB_Kafka_Producer_ MATLAB_Kafka_Producer_ mps_stream mps_stream\mps-utils mps_stream\mps-utils\Ka mps_stream\mps-utils\Ka mps_stream\mps-utils\Ka mps_stream\mps-utils\Ka mps_stream\mps-utils\Ka mps_stream\mps-utils\Ka mps_stream\mps-utils\Ka Sime_stream\test SimExecutable Simulation 	Add Folder Set Up Project (Step 2 of 2) Specify project files to automate startup tasks. Startup files automatically run (.m and .p files), load (.mat files), and open (Simulink models) when you open the project.
	Startup files:
	Shutdown files:
	Add Remove Environment: Start Simulink before this project starts Refresh Simulink customizations

Back

Finish



Sharing your code – The traditional way

- Unzip the zip file
- Find the instructions and release notes
- Decide whether you want the thing
- Remove folders from old versions from the path
- Add folders to the path
- Save the path for next time
- Find the documentation
- Do work





Sharing your code – How should you share code?

It depends on who you are sharing your code with:

- Co-authors \rightarrow Project
- End-user with MATLAB \rightarrow Toolbox or App
- End-user without MATLAB \rightarrow Deployment (application, library, C code ...)



Sharing your code with MATLAB users – Packaging your code

- Toolbox Packaging
- App Packaging

- Combine files into one installation file
- Installs in MATLAB Add-Ons or Apps tab
- Documents required products

A Package App							
C:\Documents\MATLAB\Untitled1.prj							
Pick main file		Describe your app			Package into installation file		
Main file		App Name			-		
Add main function file (program's							
entry point).			Author Name				
Add main file			Show contact info		Package		
Files included through analysis	=	Select screenshot	Summary		=		
These are the files found through							
dependency analysis.		Description			Output File		
Refresh		Description			C:\\App Name.mlappinstall		
Shared resources and helper files					Change output folder		
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files) here if referenced by any		Version					
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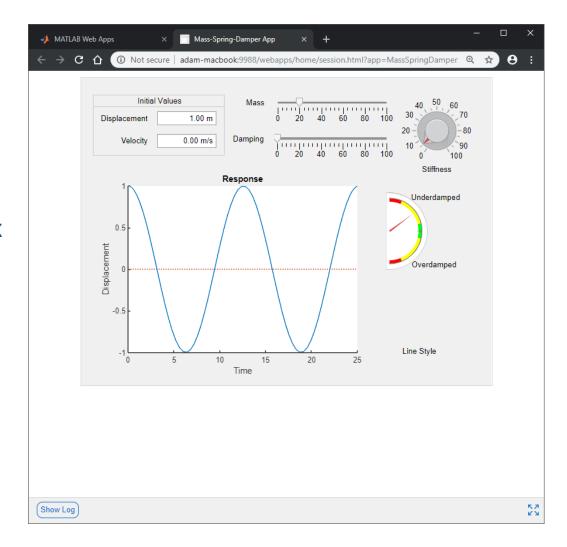
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Sharing your code outside of MATLAB – Application Deployment

Share your applications as:

- Standalone software
 MATLAB Compiler
- Web applications
 MATLAB Compiler
- Language-specific libraries MATLAB Compiler SDK
- Generated code

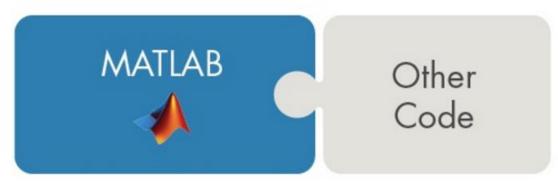
MATLAB Coder





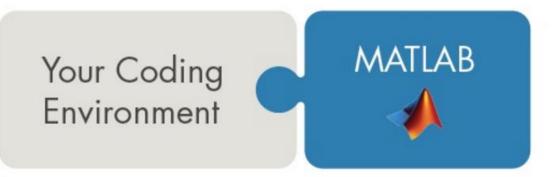
Integrating with other languages – External interfaces

Calling Libraries Written in Another Language



- Java
- Python
- C/C++
- Fortran
- COM components and ActiveX[®] controls
- RESTful, HTTP, and WSDL web services

Calling MATLAB from Another Language



- Java
- Python
- C/C++
- Fortran
- COM Automation server



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Code Maintenance – The hidden cost of development

- How do you ensure code doesn't break over time?
- How do you keep new features from breaking existing features?
- How do you maintain confidence that your code is working as expected?





Upgrading to the latest MATLAB – Code Compatibility Report

- Tool to help upgrade code to latest and greatest MATLAB
- Identifies potential compatibility issues
- Hundreds of checks for incompatibilities, errors, and warnings

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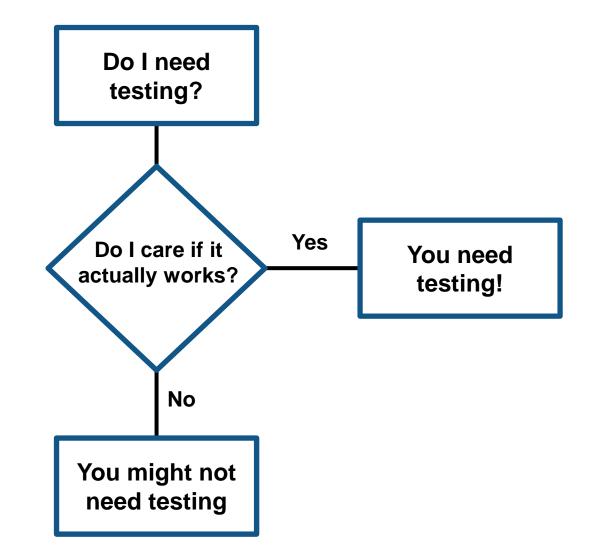


Test early, test often, test automatically

- Reduce risk of code breaking
- Catch problems early
- Improve code quality
- Document expected behaviour









Testing Frameworks

Test your code early and often

- MATLAB Unit Testing Framework
- Performance Testing Framework

App Testing Framework

	results =				
	1×17 TestResult array with properties:				
	Name				
vork	Passed				
	Failed				
	Incomplete				
	Duration				
ork	Details				
	Totals:				
	17 Passed, 0 Failed, 0 Incomplete.				
	1.0937 seconds testing time.				
	Overview				
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Testing Time: 0.4516 seconds	(Carried) © vectorBlipSize				
Overall Result: PASSED	The test passed. Duration: 0.0027 seconds Generation: 0.0027 seconds Genera				
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Testing Frameworks – Flexible development

test_Predictions.mlx

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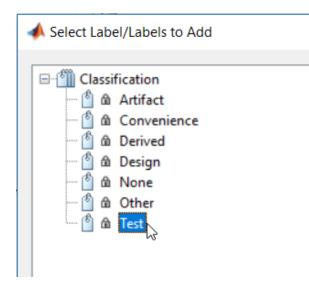
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- Script-based test
- Function-based test
- Class-based test
- Test integration with Projects



Test Pump Fault Model

This includes unit tests for the predictions

```
Test: Model type
```

Load the models and ensure they are the right types.

```
load MLModels trainedModel
mdl = trainedModel.ClassificationEnsemble;
assert(isa(mdl,'classreg.learning.classif.CompactClassificationEnsemble'),...
'Model is not a CompactClassificationEnsemble.')
```

Test: Prediction

Ensure a prediction is returned from the model using predictFcn.

```
load MLModels trainedModel
load MLData data
FaultType = trainedModel.predictFcn(data);
assert(length(FaultType) == height(data))
assert(iscategorical(FaultType))
```



Testing Frameworks – Easily customize and run existing tests

Insert 🛃 fx

Comment % 🏡 🗱

EDIT

Indent 🛐 🚑 🌠

EDITOR

 Added buttons to make testing more readily accessible

FILE

PLOTS

🗔 Find Files

🚔 Print 💌

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HOME

New

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APPS

 $\langle \Rightarrow \Rightarrow \rangle$

🚽 Go To 🔻

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NAVIGATE

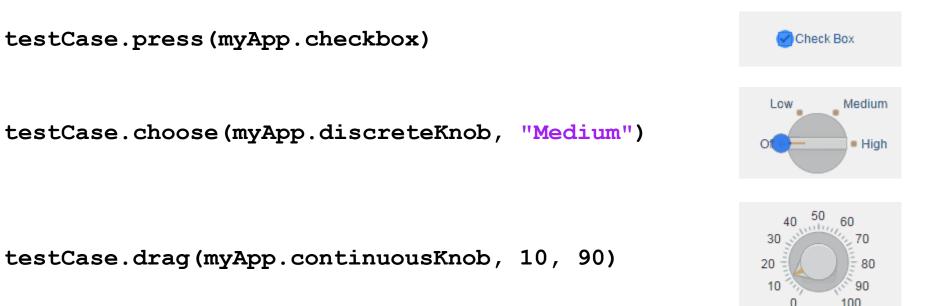
 Testing your code should be as easy as hitting the "Run" button!

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	~	Strict Apply strict checks w Parallel Run tests in parallel	ow before running tests		sb/tr	roubleshoo Default
		Output Detail Level		>		Deradite
	ERRC	OR HANDLING				1: Terse
		Pause on Errors			~	2: Concise
		Pauses execution wh	en an error occurs			3: Detailed
		Pause on Warnings Pauses execution wh	en a warning occurs	-		4: Verbose
		Pause on NaN or Inf Pauses execution wh	en a NaN or Inf value is return	ed		

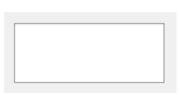


Testing Frameworks – App Testing Framework

• Verify app behavior with tests that programmatically perform gestures on a UI component



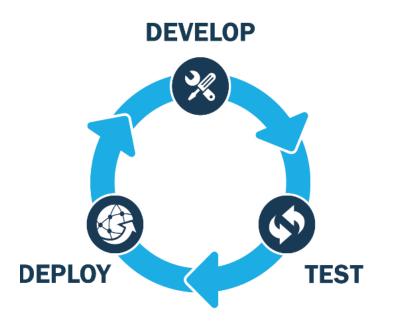
testCase.type(myApp.editfield, myTextVar)





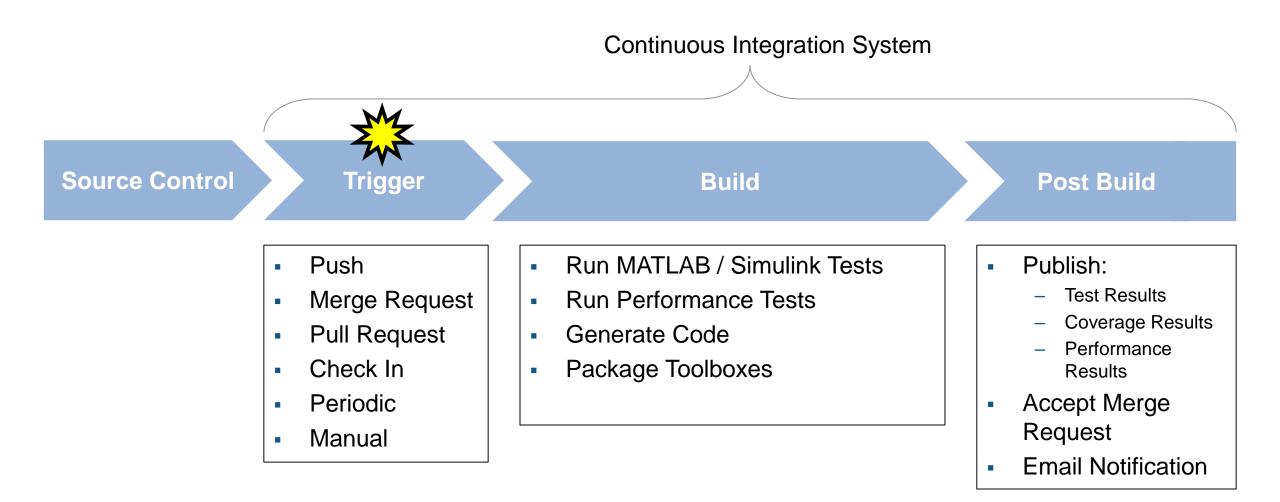
Automated Testing – Continuous Integration (CI)

- A system to automate the building, testing, integration, and deployment of code as it is being developed and maintained
- Popular CI systems: Jenkins, Travis, CircleCI, Bamboo, and others...
- Benefits:
 - Detect integration bugs early
 - Allow you to stop bugs from being accepted
 - Track and report testing history
 - Flexible testing schedules and triggers





Automated Testing – Continuous Integration workflow



Automated Testing – Jenkins plugin

- Easily connect and configure MATLAB with Jenkins
- Schedule automatic code execution and testing:
 - based on time of day
 - whenever new code changes are committed



ORebel



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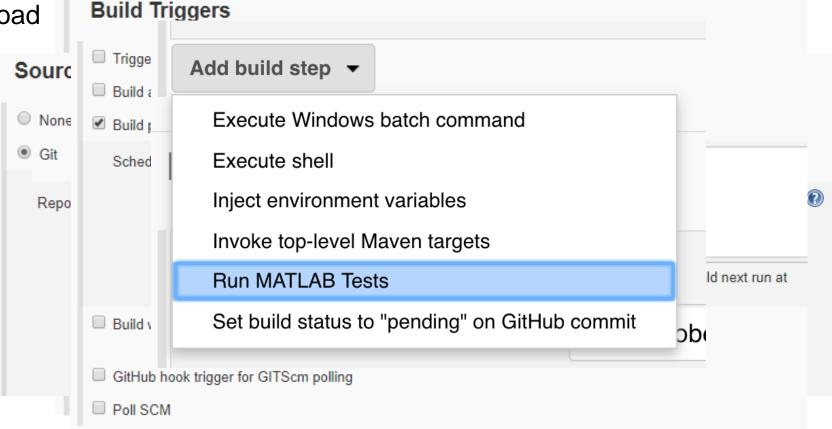
JDK Tool



Automated Testing – Jenkins plugin – Configuration

Easy configuration

- Locate MATLAB
- Identify repository to load
- Set build triggers
- Add build step





Automated Testing – Jenkins plugin – Testing reports

- View testing results
- View code coverage
- View testing reports









Agenda

Managing your code
Tracking code changes and co-authoring workflows
Writing better, robust, and portable code
Testing and maintaining your code
Summary



Key Takeaways

- You will save you time, effort, money, and frustration with good software development practices.
- MATLAB provides tools that enable agile software development.
- We're adding more software development tools and features every release!





MATLAB

is the **easiest** and most **productive** environment for **engineers** and **scientists**



