Background	Background\Education Level
	Background\Graduation Department
	Background\Current Role
	Background\Years of Programming Experience
	Background\Years of Data Science Experience
Root Causes	Root Causes\Why Data Preparaion is difficult and error-pro
	Root Causes\Why Data Exploration is difficult and error-pr
	Root Causes\Why Training model is difficult and error-pror
	Root Causes\Cell Dependency

Debugging Practice	
	Debugging Practice
Improvement and Opportunity	
	Improvement and Opportunity

Background\Education Level\Master Background\Education Level\PhD

Background\Graduation Department\Computer Science

Background\Graduation Department\Statistics

Background\Graduation Department\Finance

Background\Graduation Department\Accounting

Background\Current Role\Students

Background\Current Role\Data Engineer

Background\Current Role\Data Scientists

Background\Current Role\Software Engineer

Background\Current Role\Quantitative Analyst

Background\Years of Programming Experience\2-5 years

Background\Years of Programming Experience\5+ years

Background\Years of Data Science Experience\< 2 years

Background\Years of Data Science Experience\2-5 years

Background\Years of Data Science Experience\5+ years

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Root Causes\Why Data Preparaion is error-prone\Data is usually dirty (missing values, incomplete data,

Root Causes\Why Data Preparaion is error-prone\The data's format is unclear

Root Causes\Why Data Preparaion is error-prone\Lack of domain knowledge

Root Causes\Why Data Preparaion is error-prone\Integrating different data sources is error-prone

Root Causes\Why Data Preparaion is error-prone\Data size is too large

Root Causes\Why Data Preparaion is error-prone\Automating the data cleaning process is challenging

Root Causes\Why Data Preparaion is error-prone\Transforming unstructured data into a meaningful form one

Root Causes\Why Data Exploration is error-prone\Unfamiliar with dataset

Root Causes\Why Data Exploration is error-prone\There are too many columns to visualize, handle, or c

Root Causes\Why Data Exploration is error-prone\lt's difficult to determine which features are important

Root Causes\Why Data Exploration is error-prone\Wrong assumption about the data

Root Causes\Why Data Exploration is error-prone\Inconsistent data types

Root Causes\Why Data Exploration is error-prone\Lack of domain knowledge

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Root Causes\Why Training model is difficult and error-prone\Fine-tuning is time-consuming

Root Causes\Cell Dependency\Large notebooks can create significant dependency issues

Root Causes\Cell Dependency\Need to memorize cell dependency
Root Causes\Cell Dependency\Complex variable dependency issues
Root Causes\Cell Dependency\Rerunning from scratch can be time-consuming if dependency issues occ

Debugging Practice\Use 'print'

Debugging Practice\Search online

Debugging Practice\Organize code into functions and test

Debugging Practice\Execute cell individually to narrow down error

Debugging Practice\Rerun from the first cell

Debugging Practice\Read Error logs and trace back to the bug

Improvement and Opportunity\Tools to manage/visualize cell dependencies
Improvement and Opportunity\Need version control tools for the 'state' rather than the code.
Improvement and Opportunity\Display the current variable value
Improvement and Opportunity\On-hover features display API usage and variable types
Improvement and Opportunity\Support for breakpoints in notebooks

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