```
1 """
                                                               1 """
2 preprocessing_pipeline_steps: Implementation of pip
                                                               2 preprocessing_pipeline_steps: Implementation of pip
   eline steps to extract examples from testcases and
                                                                 eline steps to extract examples from testcases and
    construct a dataset.
                                                                  construct a dataset.
   11 11 11
3
                                                               3
                                                                 11 11 11
4
5
   import logging
                                                               5
                                                                 import logging
  import re
                                                                 import re
   import typing
                                                                 import typing
                                                                 import warnings
8
   from pipeline_framework import PipelineState, Pipel
                                                              10 from pipeline_framework import PipelineState, Pipel
   ineStep
                                                                 ineStep
                                                                 # warnings.filterwarnings('ignore',
                                                                                            message="Could not find s
                                                                 ymbol __stack_chk_fail in symbol translation table
                                                                  for disassembly")
                                                              # logging.basicConfig(filename='warnings.log', leve
                                                                 l=logging.WARNING)
                                                              # warnings.filterwarnings('ignore', category=UserWa
10
                                                              16
11
                                                              17
12 class ValidateTestcaseFilesPipelineStep(PipelineSte
                                                              18 class ValidateTestcaseFilesPipelineStep(PipelineSte
13
       step_key = "validate_testcase_files"
                                                              19
                                                                     step_key = "validate_testcase_files"
14
       def input_ready(self, input: dict) -> bool:
                                                                     def input_ready(self, input: dict) -> bool:
                                                              21
           return "testcases" in input.keys()
                                                                         return "testcases" in input.keys()
16
                                                              22
17
18
       def execute(self, input: dict, output: dict) ->
                                                              24
                                                                     def execute(self, input: dict, output: dict) ->
   None:
                                                                 None:
19
           import preprocessing
                                                              25
                                                                         import preprocessing
                                                              26
21
           output_testcases = []
                                                              27
                                                                         output_testcases = []
           for testcase in input["testcases"]:
22
                                                              28
                                                                         for testcase in input["testcases"]:
23
               testcase["Valid"] = preprocessing.valid
                                                              29
                                                                             testcase["Valid"] = preprocessing.valid
   ate_testcase_files(testcase)
                                                                 ate_testcase_files(testcase)
24
               output_testcases += [testcase]
                                                              30
                                                                             output_testcases += [testcase]
25
                                                              31
           output["testcases"] = output_testcases
                                                                         output["testcases"] = output_testcases
27
                                                              33
       def output_ready(self, output: dict) -> typing.
                                                                     def output_ready(self, output: dict) -> typing.
                                                              34
28
   Optional[bool]:
                                                                 Optional[bool]:
           return "testcases" in output.keys() and all
                                                                         return "testcases" in output.keys() and all
29
                                                              36
30
               [
31
                   "Valid" in testcase.keys() and test
                                                              37
                                                                                  "Valid" in testcase.keys() and test
   case["Valid"]
                                                                 case["Valid"]
32
                   for testcase in output["testcases"]
                                                              38
                                                                                  for testcase in output["testcases"]
33
                                                              39
34
                                                              40
                                                                         )
           )
35
                                                              41
36
                                                              42
   class ExtractExamplesPipelineStep(PipelineStep):
                                                              43 class ExtractExamplesPipelineStep(PipelineStep):
37
38
       step_key = "extract_examples"
                                                              44
                                                                     step_key = "extract_examples"
39
                                                              45
       def __init__(
                                                                     def __init__(
40
                                                              46
41
           self,
                                                              47
                                                                         self,
           config: dict,
                                                                         config: dict,
42
                                                              48
43
           state: PipelineState,
                                                              49
                                                                         state: PipelineState,
           logger: logging.Logger,
                                                              50
                                                                         logger: logging.Logger,
44
45
           emit_primary_good_function: bool = True,
                                                              51
                                                                         emit_primary_good_function: bool = True,
```

```
46
                                                              52
                                                                          label_granularity: typing.Optional[str] = N
           label granularity: typing.Optional[str] = N
   one.
                                                                  one.
47
           context_granularity: typing.Optional[str] =
                                                              53
                                                                          context_granularity: typing.Optional[str] =
   None,
                                                                  None,
48
                                                               54
       ):
49
           super().__init__(config, state, logger)
                                                              55
                                                                          super().__init__(config, state, logger)
50
                                                              56
51
           import preprocessing
                                                               57
                                                                          import preprocessing
52
                                                               58
           self.extract_fn = lambda testcase: preproce
53
                                                              59
                                                                          if self.state.malware:
   ssing.extract_examples(
               testcase,
                                                                              self.extract_fn = lambda testcase: prep
                                                                  rocessing.extract_examples_malware(
                label_granularity=preprocessing.Granula
                                                              61
                                                                                  testcase,
   rity[label_granularity]
56
               if label_granularity is not None
                                                              62
                                                                                   label_granularity=preprocessing.Gra
                                                                  nularity[label_granularity]
57
                                                              63
                                                                                  if label_granularity is not None
                else None,
58
                context_granularity=preprocessing.Granu
                                                              64
                                                                                   else None,
   larity[context_granularity]
59
                if context_granularity is not None
                                                              65
                                                                                  context_granularity=preprocessing.G
                                                                   ranularity[context_granularity]
                                                                                   if context_granularity is not None
60
                else None,
                                                              66
                                                              67
61
                emit_primary_good_function=emit_primary
                                                                                   else None,
    _good_function,
                logger=self.logger,
                                                                                   emit_primary_good_function=emit_pri
                                                                  mary_good_function,
63
                                                              69
                                                                                   logger=self.logger
                                                               70
                                                               71
                                                                          else:
                                                               72
                                                                              self.extract_fn = lambda testcase: prep
                                                                   rocessing.extract_examples(
                                                               73
                                                                                  testcase,
                                                                                  label_granularity=preprocessing.Gra
                                                                  nularity[label_granularity]
                                                                                  if label_granularity is not None
                                                               76
                                                                                  else None,
                                                                                  context_granularity=preprocessing.G
                                                                  ranularity[context_granularity]
                                                                                  if context_granularity is not None
                                                               78
                                                               79
                                                                               else None,
                                                                                  \verb"emit_primary_good_function=emit_pri"
                                                              80
                                                                  mary_good_function,
                                                              81
                                                                                  logger=self.logger
                                                              82
                                                               83
65
       def input_ready(self, input: dict) -> bool:
                                                                      def input_ready(self, input: dict) -> bool:
                                                               84
66
           return (
                                                              85
                                                                          return (
67
                "cwes" in input.keys()
                                                                               "cwes" in input.keys()
68
                and "testcases" in input.keys()
                                                               87
                                                                              and "testcases" in input.keys()
69
                and all(
                                                                              and all(
70
                                                              89
                    Ε
                                                                                   Γ
                        "Valid" in testcase.keys() and
                                                                                       "Valid" in testcase.keys() and
                                                              90
    testcase["Valid"]
                                                                   testcase["Valid"]
                        for testcase in input["testcase
                                                               91
                                                                                       for testcase in input["testcase
   s"]
                                                                  s"1
                    ]
                                                              92
                                                                                   ]
74
                )
                                                               93
                                                                              )
75
           )
                                                               94
                                                                          )
76
                                                               95
       def execute(self, input: dict, output: dict) ->
                                                              96
                                                                      def execute(self, input: dict, output: dict) ->
   None:
78
                                                              97
                                                                          output_examples = []
           output_examples = []
           for testcase in input["testcases"]:
                                                                          for testcase in input["testcases"]:
79
                                                              98
80
                output_examples += self.extract_fn(test
                                                              99
   case)
```

```
output_examples += self.extract_fn
                                                                  (testcase)
                                                             101
                                                                              except Exception as ex:
                                                             102
                                                                                   print(ex)
 81
                                                             103
 82
            self.logger.info(
                                                             104
                                                                          self.logger.info(
                f"Extracted {len(output_examples)} exam
                                                                              f"Extracted {len(output_examples)} exam
                                                             105
    ples from {len(input['testcases'])} testcases"
                                                                  ples from {len(input['testcases'])} testcases"
 84
                                                             106
 85
                                                             107
            output["examples"] = output_examples
                                                                          output["examples"] = output_examples
 86
                                                             108
 87
                                                             109
        def output readv(self, output: dict) -> typing.
                                                                      def output readv(self, output: dict) -> typing.
 88
                                                             110
    Optional[bool]:
                                                                  Optional[bool]:
           return "examples" in output.keys()
                                                                          return "examples" in output.keys()
 89
                                                             111
 90
                                                             112
 91
                                                             113
 92
    class LabelExamplesPipelineStep(PipelineStep):
                                                             114
                                                                  class LabelExamplesPipelineStep(PipelineStep):
 93
        step_key = "label_examples"
                                                             115
                                                                      step_key = "label_examples"
 94
                                                             116
        def input_ready(self, input: dict) -> bool:
                                                                      def input_ready(self, input: dict) -> bool:
 95
                                                             117
            return "examples" in input.keys()
                                                                          return "examples" in input.keys()
 96
                                                             118
97
                                                             119
 98
        def execute(self, input: dict, output: dict) ->
                                                             120
                                                                      def execute(self, input: dict, output: dict) ->
    None:
                                                                  None:
99
            import preprocessing
                                                             121
                                                                          import preprocessing
                                                             122
            label_strategy = preprocessing.LabelStrateg
                                                             123
                                                                          label_strategy = preprocessing.LabelStrateg
101
    y[self.config["label_strategy"]]
                                                                  y[self.config["label_strategy"]]
102
                                                             124
            output_examples = []
                                                                          output_examples = []
103
                                                             125
104
            for example in input["examples"]:
                                                             126
                                                                          for example in input["examples"]:
                example["Label"] = preprocessing.label_
                                                                              example["Label"] = preprocessing.label_
105
                                                             127
    example(example, label_strategy)
                                                                  example(example, label_strategy)
106
                output_examples += [example]
                                                             128
                                                                              output_examples += [example]
107
                                                             120
            output["examples"] = output_examples
                                                                          output["examples"] = output_examples
                                                             130
109
                                                             131
            if label_strategy == preprocessing.LabelStr
                                                                          if label_strategy == preprocessing.LabelStr
    ategy.BINARYCLASSIFICATION:
                                                                  ategy.BINARYCLASSIFICATION:
                                                                              output["label_encoding"] = {"Good": 0,
                output["label encoding"] = {"Good": 0,
111
     "Bad": 1}
                                                                   "Bad": 1}
112
            else:
                                                             134
                raise NotImplementedError("Labelstrated
                                                             135
                                                                              raise NotImplementedError("Labelstrated
113
    y not implemented!")
                                                                  y not implemented!")
                                                             136
114
115
        def output_ready(self, output: dict) -> typing.
                                                             137
                                                                      def output_ready(self, output: dict) -> typing.
    Optional[bool]:
                                                                  Optional[bool]:
                                                                         return (
116
            return (
                                                             138
                "examples" in output.keys()
                                                                              "examples" in output.keys()
117
                                                             139
                and all(["Label" in example.keys() for
                                                                              and all(["Label" in example.keys() for
118
                                                             140
                                                                   example in output["examples"]])
     example in output["examples"]])
                and "label_encoding" in output.keys()
                                                                              and "label_encoding" in output.keys()
119
                                                             141
120
                                                             142
            )
                                                                          )
                                                             144
122
123 class RemoveDuplicateExamplesPipelineStep(PipelineS
                                                             145 class RemoveDuplicateExamplesPipelineStep(PipelineS
    ten):
                                                                  ten):
                                                                      step_key = "remove_duplicate_examples"
        step key = "remove duplicate examples"
124
                                                             146
125
                                                             147
        def input_ready(self, input: dict) -> bool:
                                                                      def input_ready(self, input: dict) -> bool:
126
                                                             148
127
            return "examples" in input.keys()
                                                             149
                                                                          return "examples" in input.keys()
128
                                                             150
129
        def execute(self, input: dict, output: dict) ->
                                                             151
                                                                      def execute(self, input: dict, output: dict) ->
    None:
                                                                  None:
130
                                                             152
            import numpy as np
                                                                          import numpy as np
131
                                                             153
132
            # Some accounting
                                                             154
                                                                          # Some accounting
            observed_representations = set()
                                                                          observed_representations = set()
                                                             155
```

```
kept_examples = 0
                                                                           kept examples = 0
                                                              157
136
            # Shuffle examples to avoid bias from order
                                                                           # Shuffle examples to avoid bias from order
    ing
                                                                   ing
137
            shuffled_input_examples = list(input["examp
                                                              159
                                                                           shuffled_input_examples = list(input["examp
                                                                   les"])
    les"])
            rs = np.random.RandomState(self.config["see
                                                                           rs = np.random.RandomState(self.config["see
138
                                                              160
    d"])
                                                                   d"])
            rs.shuffle(shuffled_input_examples)
                                                                           rs.shuffle(shuffled_input_examples)
139
                                                              161
140
                                                              162
            # Mark which examples are kept
                                                                           # Mark which examples are kept
141
                                                              163
142
            for example in input["examples"]:
                                                              164
                                                                           for example in input["examples"]:
                 # Descramble examples to reinstate non-
                                                                               # Descramble examples to reinstate non-
143
                                                              165
    unique representations
                                                                   unique representations
                normalized_text_representation = re.sub
                                                              166
                                                                               normalized_text_representation = re.sub
    (
                                                                   (
                     r"!lc[0-9]+:", "", example["Exampl
                                                                                   r"!lc[0-9]+:", "", example["Exampl
                                                              167
145
146
                                                              168
147
                                                              169
148
                # Use the power of python's set impleme
                                                              170
                                                                               # Use the power of python's set impleme
    ntation to check for uniqueness
                                                                   ntation to check for uniqueness
149
                if normalized_text_representation not i
                                                              171
                                                                               if normalized_text_representation not i
    n observed representations:
                                                                   n observed representations:
150
                     observed_representations |= {normal
                                                              172
                                                                                   observed_representations |= {normal
    ized_text_representation}
                                                                   ized_text_representation}
151
                                                              173
                     # Mark example as kept
                                                                                   # Mark example as kept
152
                                                              174
153
                     example["Keep"] = True
                                                              175
                                                                                   example["Keep"] = True
154
                     kept_examples += 1
                                                                                   kept_examples += 1
155
                else:
                                                              177
                                                                               else:
                     example["Keep"] = False
                                                                                   example["Keep"] = False
                                                              178
                                                              179
157
158
            self.logger.info(
                                                                           self.logger.info(
                f" Duplicate \ examples \ removed: \ \{len(inpu
159
                                                              181
                                                                               f"Duplicate examples removed: {len(inpu
    t['examples']) - kept_examples} of {len(input['exam
                                                                   t['examples']) - kept_examples} of {len(input['exam
    ples'])}. Remaining: {kept_examples}"
                                                                   ples'])}. Remaining: {kept_examples}"
160
                                                              182
161
                                                              183
162
            # Preserve the order of the examples
                                                              184
                                                                           # Preserve the order of the examples
            output["examples"] = [ex for ex in input["e
                                                                           output["examples"] = [ex for ex in input["e
    xamples"] if ex["Keep"]]
                                                                   xamples"] if ex["Keep"]]
            assert len(output["examples"]) == kept_exam
                                                                           assert len(output["examples"]) == kept_exam
164
                                                              186
    ples
                                                                   ples
165
                                                              187
        def output_ready(self, output: dict) -> typing.
166
                                                              188
                                                                       def output ready(self, output: dict) -> typing.
    Optional[bool]:
                                                                   Optional[bool]:
167
            return "examples" in output.keys()
                                                              189
                                                                           return "examples" in output.keys()
169
                                                              191
    class AssignSplitToExamplesPipelineStep(PipelineSte
                                                              192 class AssignSplitToExamplesPipelineStep(PipelineSte
170
                                                                   p):
171
        step_key = "assign_split_to_examples"
                                                              193
                                                                       step_key = "assign_split_to_examples"
172
                                                              194
173
        def __init__(
                                                              195
                                                                       def __init__(
174
            self,
                                                                           self,
                                                              196
175
            config: dict,
                                                              197
                                                                           config: dict,
176
            state: PipelineState,
                                                                           state: PipelineState,
177
            logger: logging.Logger,
                                                              199
                                                                           logger: logging.Logger,
178
            validation_fraction: float,
                                                                           validation_fraction: float,
            test_fraction: float,
                                                                           test_fraction: float,
179
                                                              201
180
        ):
                                                              202
                                                                       ):
181
            super().__init__(config, state, logger)
                                                              203
                                                                           super().__init__(config, state, logger)
182
                                                              204
                                                              205
183
            self.validation fraction = validation fract
                                                                           self.validation fraction = validation fract
    ion
                                                                   ion
184
            self.test_fraction = test_fraction
                                                              206
                                                                           self.test_fraction = test_fraction
185
                                                              207
```

156

134

```
186
        def input_ready(self, input: dict) -> bool:
                                                              208
                                                                       def input_ready(self, input: dict) -> bool:
            return "examples" in input.keys()
                                                                           return "examples" in input.keys()
187
188
                                                              210
        def execute(self, input: dict, output: dict) ->
                                                                       def execute(self, input: dict, output: dict) ->
189
                                                              211
    None:
                                                                   None:
190
            import numpy as np
                                                              212
                                                                           import numpy as np
191
                                                              213
192
            output_examples = list(input["examples"])
                                                              214
                                                                           output_examples = list(input["examples"])
193
                                                              215
            # Count examples exactly
                                                              216
                                                                           # Count examples exactly
195
            validation_count: int = int(
                                                              217
                                                                           validation_count: int = int(
196
                np.ceil(self.validation_fraction * len
                                                                               np.ceil(self.validation_fraction * len
    (output_examples))
                                                                   (output examples))
197
                                                              219
            )
                                                                           )
            test_count: int = int(np.ceil(self.test_fra
                                                                           test_count: int = int(np.ceil(self.test_fra
198
                                                              220
    ction * len(output_examples)))
                                                                   ction * len(output_examples)))
            train_count = len(output_examples) - (valid
                                                                           train_count = len(output_examples) - (valid
                                                              221
    ation_count + test_count)
                                                                   ation_count + test_count)
201
            # Make sure no split is below zero unless t
                                                              223
                                                                           # Make sure no split is below zero unless t
    he user wants it
                                                                   he user wants it
            assert validation_count > 0 or self.validat
                                                                           assert validation_count > 0 or self.validat
                                                              224
    ion fraction == 0.0
                                                                   ion fraction == 0.0
203
            assert test count > 0 or self.test fraction
                                                              225
                                                                           assert test count > 0 or self.test fraction
    == 0.0
                                                                   == 0.0
            assert train_count > 0
                                                                           assert train_count > 0
204
                                                              226
205
                                                              227
            # Shuffle examples
                                                              228
                                                                           # Shuffle examples
206
207
            rs = np.random.RandomState(self.config["see
                                                              229
                                                                           rs = np.random.RandomState(self.config["see
    d"])
                                                                   d"])
208
            rs.shuffle(output_examples)
                                                              230
                                                                           rs.shuffle(output_examples)
                                                              231
209
210
            for i, output_example in enumerate(output_e
                                                              232
                                                                           for i, output_example in enumerate(output_e
    xamples):
                                                                   xamples):
211
                if i <= train_count:</pre>
                                                              233
                                                                               if i <= train_count:</pre>
                     output_example["Split"] = "Trainin
                                                                                   output_example["Split"] = "Trainin
212
213
                elif i <= (train_count + validation_cou</pre>
                                                              235
                                                                               elif i <= (train_count + validation_cou
                                                                   nt):
    nt):
                     output_example["Split"] = "Validati
214
                                                              236
                                                                                   output_example["Split"] = "Validati
    on"
                                                                   on"
215
                                                              237
216
                     output example["Split"] = "Test"
                                                              238
                                                                                   output example["Split"] = "Test"
                                                              239
217
218
            self.logger.info(
                                                              240
                                                                           self.logger.info(
                 f"Assigned {len(output_examples)} examp
                                                                               f"Assigned {len(output_examples)} examp
219
                                                              241
    les to {train_count} training, {validation_count} v
                                                                   les to {train_count} training, {validation_count} v
    alidation and {test_count} test examples"
                                                                   alidation and {test_count} test examples"
220
            )
                                                              242
                                                                           )
                                                              243
            output["examples"] = output_examples
                                                                           output["examples"] = output_examples
222
                                                              244
223
                                                              245
        def output_ready(self, output: dict) -> typing.
                                                                       def output_ready(self, output: dict) -> typing.
    Optional[bool]:
                                                                   Optional[bool]:
            return "examples" in output.keys() and all(
                                                                           return "examples" in output.keys() and all(
225
                                                              247
                 ["Split" in example.keys() for example
                                                                               ["Split" in example.keys() for example
     in output["examples"]]
                                                                    in output["examples"]]
            )
                                                              249
                                                                           )
228
                                                              250
                                                              252
230
    all = [
                                                                   all = [
        "ValidateTestcaseFilesPipelineStep",
                                                              253
                                                                       "ValidateTestcaseFilesPipelineStep",
        "ExtractExamplesPipelineStep",
232
                                                              254
                                                                       "ExtractExamplesPipelineStep",
        "LabelExamplesPipelineStep",
                                                                       "LabelExamplesPipelineStep",
233
        "RemoveDuplicateExamplesPipelineStep",
                                                                       "RemoveDuplicateExamplesPipelineStep",
234
                                                              256
        "AssignSplitToExamplesPipelineStep",
                                                                       "AssignSplitToExamplesPipelineStep",
                                                              258 ]
236 ]
                                                              259
```