# Exercise 7. Creating a machine learning model with Watson Knowledge Studio

### **Estimated time**

01:15

### Overview

This exercise helps you understand the process for building a machine learning model that you can later deploy and use with other Watson services.

# **Objectives**

After completing this exercise you should be able to:

- Create a workspace for Watson Knowledge Studio.
- · Configure the workspace resources.
- · Create document sets
- Pre-annotate documents
- Create tasks for human annotators
- Analyze inter-annotator agreement and adjudicate conflicts in annotated documents
- Create machine learning models.

### Introduction

Use IBM Watson™ Knowledge Studio to create a machine learning model that understands the linguistic nuances, meaning, and relationships specific to a certain industry or domain. Knowledge Studio provides easy-to-use tools for annotating unstructured domain literature and uses those annotations to create a custom machine learning model that understands the language of the domain.

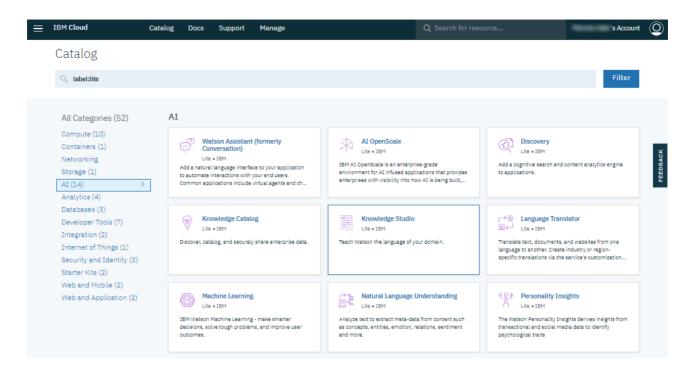
# Requirements

IBM Cloud account.

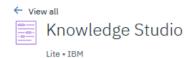
# **Exercise instructions**

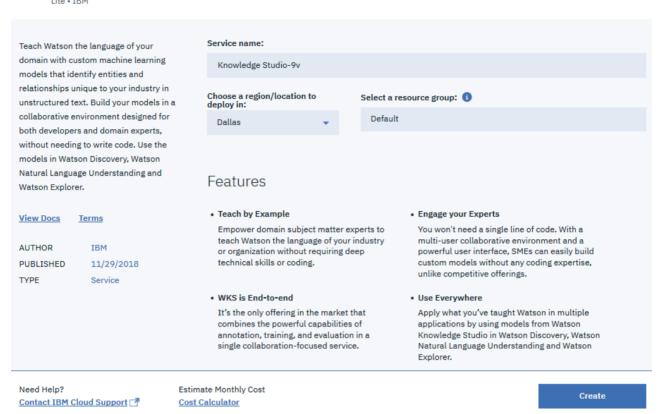
In this exercise you will complete the following tasks:

1.	Create a Knowledge Studio service.
2.	Create a workspace.
3.	Create a type system.
4.	Add a dictionary.
5.	Add documents for annotation
6.	Create annotation sets
7.	Pre-annotate with a dictionary-based annotator
8.	Create an annotation task
9.	Annotate documents
10.	Analyze inter-annotator agreement
11.	Adjudicate conflicts in annotated documents
12.	Create a machine learning model
Part 1. Creating a Knowledge Studio service instance	
In this	part, you will create a Knowledge Studio service instance on IBM Cloud.
Perform	m the following steps:
1.	Log in to IBM Cloud using your IBMid.
2.	Click <b>Catalog</b> > <b>AI</b> . All the AI services are listed.
3	Click the Knowledge Studio tile

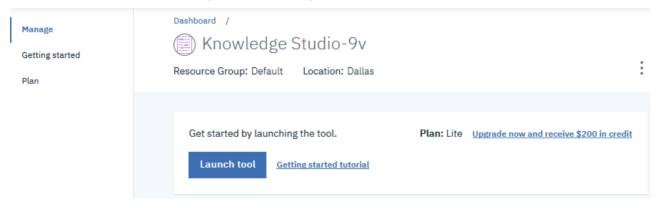


\_\_\_ 4. Accept the default values and click **Create** to create a Lite plan instance of the Knowledge Studio service.

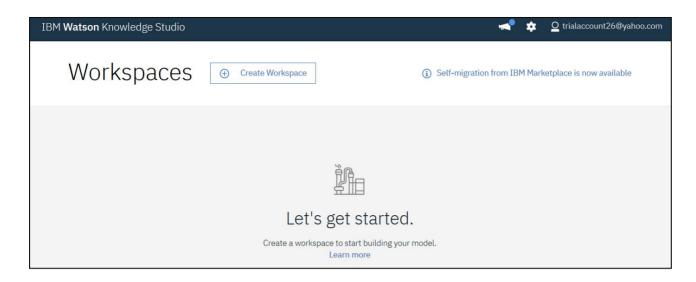




\_\_ 5. After the instance is created, click Manage (left menu), and then click Launch Tool to open the Watson Knowledge Studio tooling.



\_\_\_ 6. The Workspaces page is displayed. (Dismiss or close any pop-ups).



# Part 2. Creating a workspace

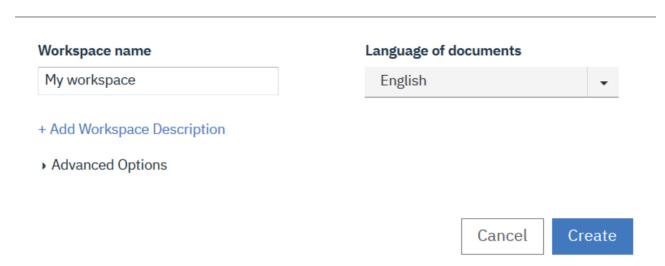
In this part, you will learn how to create a workspace in Watson Knowledge Studio. A workspace defines all the resources that are required to create a machine learning model, including training documents, the type system, dictionaries, and annotations that are added by human annotators.

Perform the following steps:

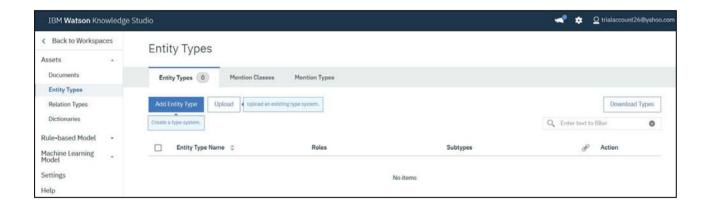
- \_\_ 1. Click + Create Workspace
- 2. Specify the details for the new workspace:
  - a. In the **Workspace name** field, type *My workspace*.
  - b. In the **Language of documents** field, use the default value, **English**. The sample files you will be using for this tutorial are in English.
- \_\_ 3. Click Create.

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# **Create Workspace**



\_ 4. After the workspace is successfully created it opens automatically and the Entity Types page is displayed as shown in the figure.



# Part 3. Creating a type system

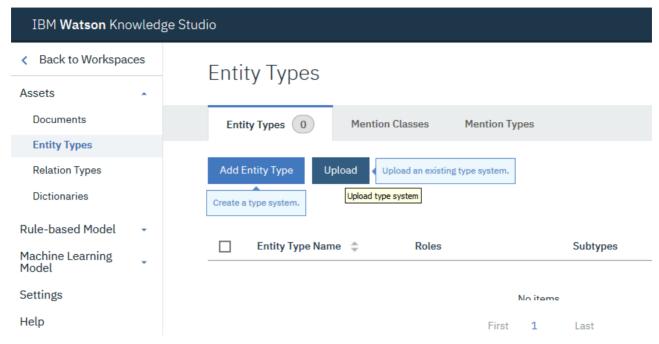
A type system defines things that are interesting in your domain content that you want to label with an annotation. The type system controls how content can be annotated by defining the types of entities that can be labeled and how relationships among different entities can be labeled. Typically subject matter experts for a domain help to define the type system.

In this part, you will learn how to upload and modify a type system within Knowledge Studio. You must create or upload a type system before you begin any annotation tasks.

Perform the following steps:

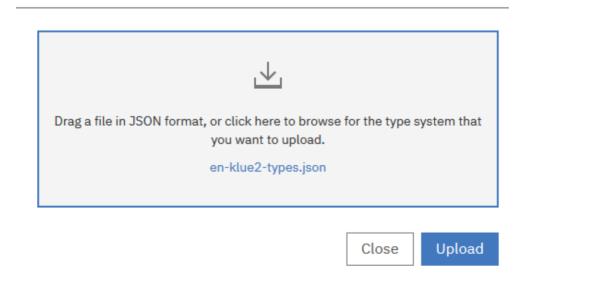
\_ 1. Download the <u>en-klue2-types.json</u> file to your computer. This file contains an example type system.

- \_ 2. Click Assets > Entity Types.
- \_\_ 3. On the Entity Types page, click Upload.

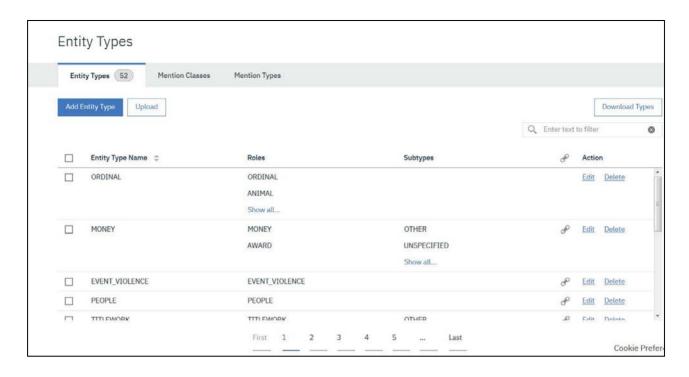


\_\_\_ 4. Upload the *en-klue2-types.json* file from your computer. Click **Upload** after specifying the json file to upload.

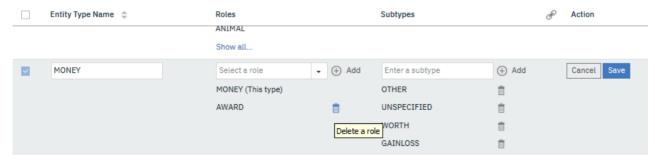
# **Upload a Type System**



\_ 5. The uploaded type system is displayed in the table as shown in the figure.



- \_\_\_ 6. Browse the type system so you can see the data that was uploaded.
- \_\_ 7. Edit an entity type:
  - \_\_ a. Locate the **MONEY** entity type.
  - \_\_ b. Double-click anywhere in the table row to edit the entity type.
  - \_\_ c. In the **Roles** column, click the delete icon next to the **AWARD** role.
  - \_\_ d. Click Save.



After you finish making changes to the type system, you can begin adding documents to your workspace.

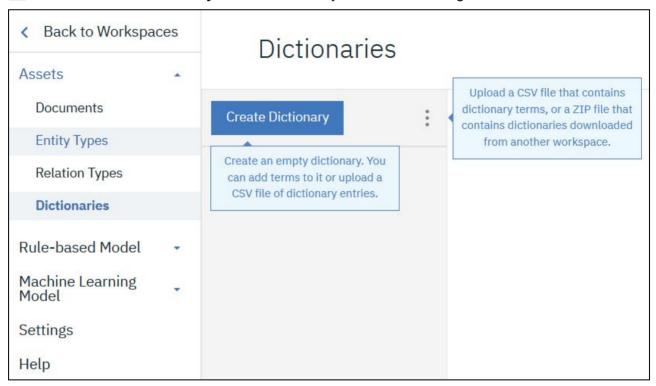
# Part 4. Adding a dictionary

To help human annotators get started with their annotation tasks, you can create a dictionary and use it to pre-annotate documents that you add to the corpus.

In this part, you will learn how to add a dictionary to a workspace in Knowledge Studio. Dictionaries are used for pre-annotating text when creating a machine learning model.

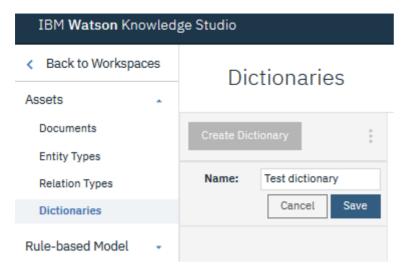
### Perform the following steps:

- 1. Download the file <u>dictionary-items-organization.csv</u> to your computer. This file contains dictionary terms in CSV format, suitable for uploading into a Knowledge Studio dictionary.
- 2. Click Assets > Dictionaries.
- \_\_ 3. Click **Create Dictionary** to add a dictionary as shown in the figure.

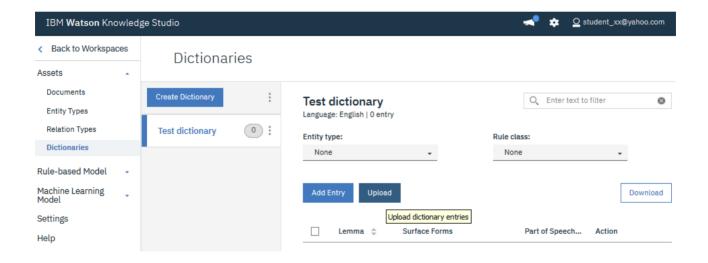


**Note:** Do not click **Upload Dictionary**, which is used to upload a dictionary that you want to use as-is. For this exercise, you will create a new editable dictionary and then upload terms into it.

\_\_\_ 4. In the **Name** field, type *Test dictionary* and click **Save** to create the (empty) dictionary.

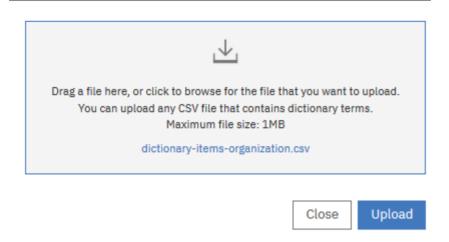


\_\_\_ 5. The new dictionary is created and automatically opened for editing.



- \_\_ 6. In the dictionary pane, click **Upload**.
- \_\_\_ 7. Upload the file *dictionary-items-organization.csv* from your computer.

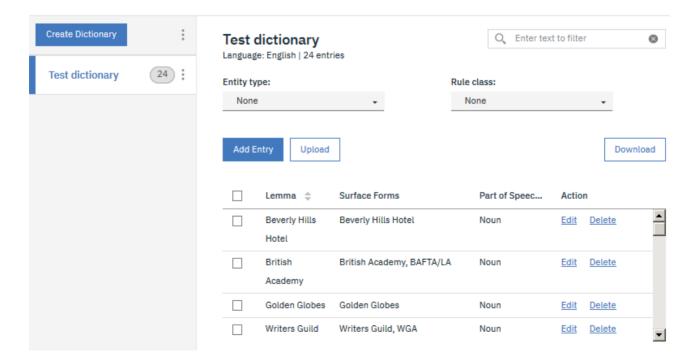
# **Upload Dictionary Entries**



The terms in the file are uploaded into the dictionary.

\_\_ 8. Click **Add Entry** to create a new term. An editable row is added at the top of the table.

### Dictionaries



\_\_ 9. In the Surface Forms column, type IBM and International Business Machines Corporation on separate lines. When you begin to type a new surface form, a space is added below for an additional surface form. Leave the radio button next to IBM selected, which indicates that IBM is the lemma.

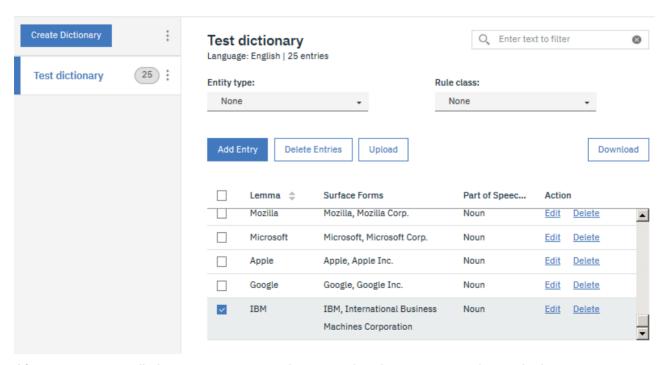
<u>Information:</u> Lemma specifies the most representative word form for the entry and *surface forms* specify equivalent terms.

- \_\_\_ 10. In the **Part of Speech** column, select **Noun**.
- \_\_ 11. Click Save.



\_\_\_ 13. Scroll through the entries to confirm that the new term has been added to the dictionary.

### Dictionaries



After you create a dictionary, you can use it to speed up human annotation tasks by preannotating the documents.

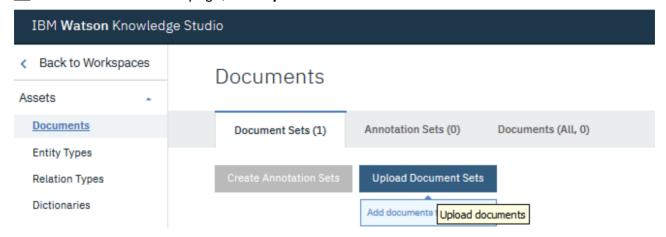
# Part 5. Adding documents for annotation

To train a model, you must add documents that are representative of your domain content to your workspace. As a best practice, start with a relatively small collection of documents. Use these documents to train human annotators and to refine the annotation guidelines. As annotation accuracy improves, you can add more documents to the corpus to provide greater depth to the training effort.

In this part, you will learn how to add documents to a workspace in Knowledge Studio that can be annotated by human annotators.

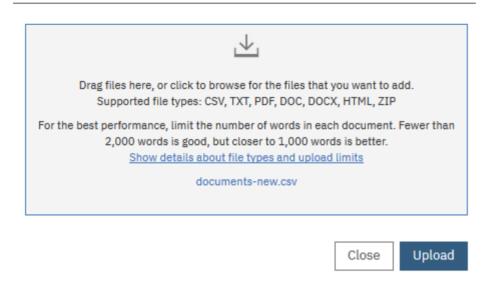
### Perform the following steps:

- \_\_ 1. Download the file <u>documents-new.csv</u> to your computer. This file contains example documents suitable for uploading.
- \_\_\_ 2. Within your workspace, click **Assets** > **Documents**.
- 3. On the Documents page, click **Upload Document Sets.**

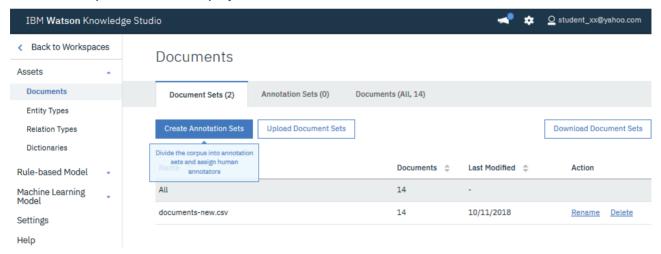


\_\_\_ 4. Upload the file *documents-new.csv* from your computer. Specify the file to upload and click **Upload**.

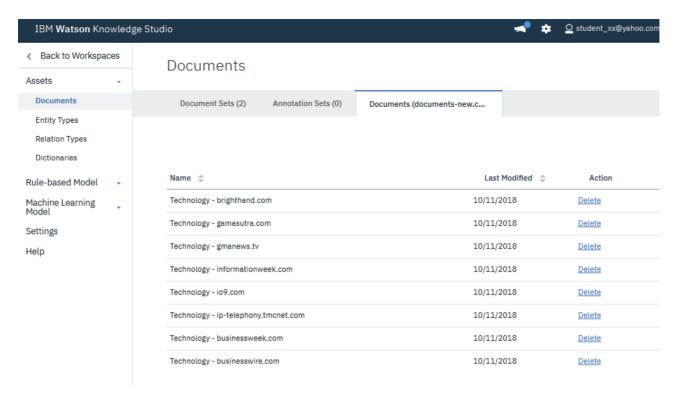
### Add a Document Set



\_ 5. The uploaded file is displayed in the table.



\_\_ 6. Click documents-new.csv to browse the documents that were uploaded.



\_\_\_ 7. Click on a document to display the text.

You can now divide the corpus into multiple document sets and assign the document sets to human annotators.

# Part 6. Creating annotation sets

An annotation set is a subset of documents from an uploaded document set that you assign to a human annotator. The human annotator annotates the documents in the annotation set. To later use inter-annotator scores to compare the annotations that are added by each human annotator, you must assign at least two human annotators to different annotation sets. You must also specify that some percentage of documents overlap between the sets.

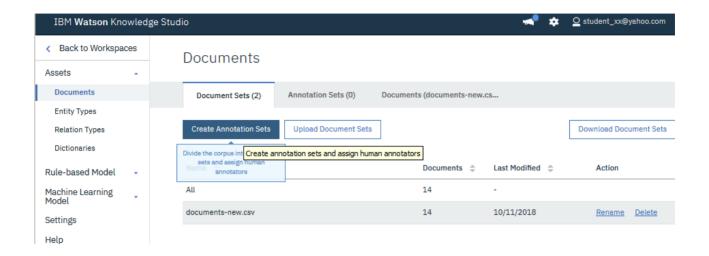
In this part, you will learn how to create annotation sets in Knowledge Studio

**Note:** In a realistic scenario, many users with different roles can have access to one workspace to collaborate, the different roles are Admin, Project Manager, and Human Annotator. In this exercise you are using a Lite plan for Watson Knowledge Studio which allows only one user in the workspace (you) with the Administrator role. Normally, you would create as many annotation sets as needed, based on the number of human annotators who are working in the workspace. In this exercise, you will create two annotation sets and you will assign both annotation sets to the same user (you).

Perform the following steps:

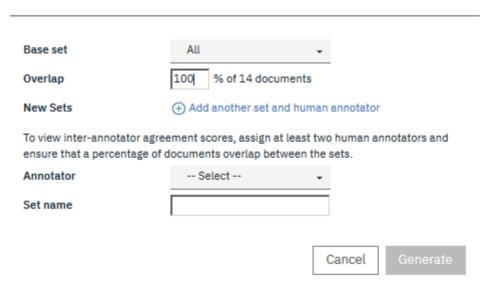
\_\_\_ 1. Within your workspace, click **Assets** > **Documents**.

- 2. Click the **Document Sets** tab.
- 3. Click Create Annotation Sets.



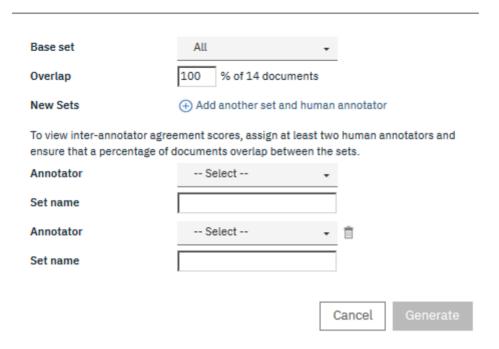
The Create Annotation Sets window opens. By default, this window shows the base set, which contains all documents, and fields where you can specify the information for a new annotation set.

### **Create Annotation Sets**



4. Click Add another set and human annotator to add fields for an additional annotation set. You can click to add as many annotation sets as you want to create. For this exercise, you need only two annotation sets.

### **Create Annotation Sets**

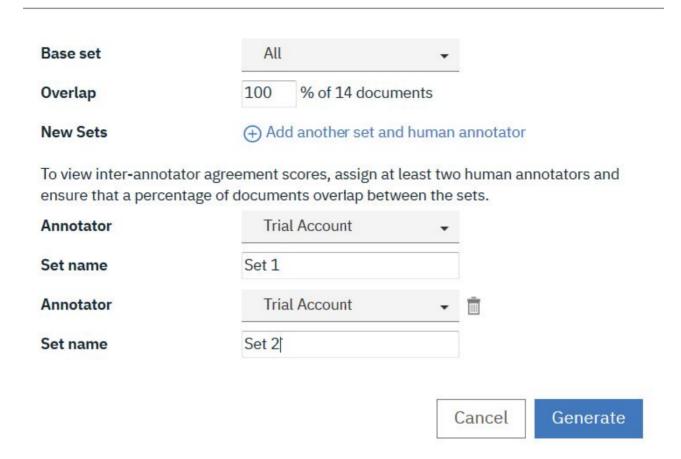


- \_\_\_ 5. In the **Overlap** field, specify 100. This value specifies that you want 100 percent of the documents in the base set to be included in all the new annotation sets so they can be annotated by all human annotators.
- \_\_\_ 6. For each new annotation set, specify the required information.
  - In the **Annotator** field, select a human annotator user ID to assign to the new annotation set. For this exercise, the administrator will act as human annotator.

**<u>Note</u>**: In a realistic scenario, each annotation set is assigned to a different human annotator, as you would have multiple human annotators.

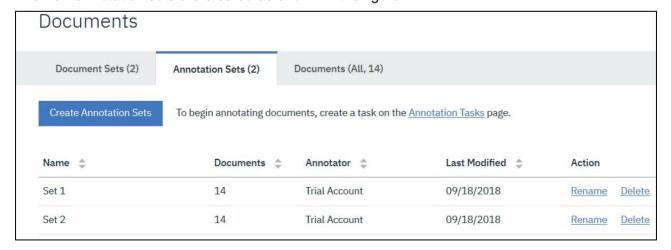
• In the **Set name** field, specify a descriptive name for the annotation set. For this exercise, you can use the names, *Set 1* and *Set 2*.

# **Create Annotation Sets**



### \_\_ 7. Click Generate

The new annotation sets are created as shown in the figure.



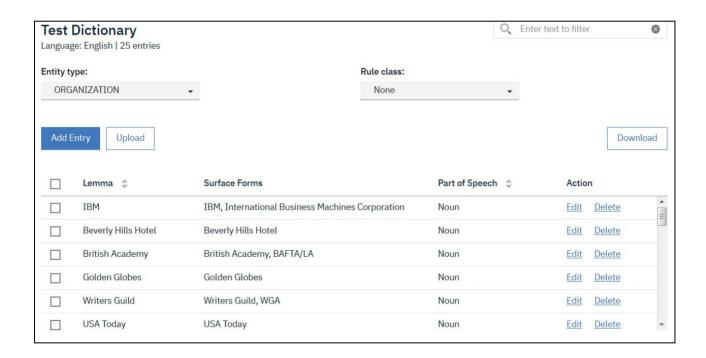
### Part 7. Pre-annotating with a dictionary-based annotator

Pre-annotating documents bootstraps the annotation effort of the human annotators.

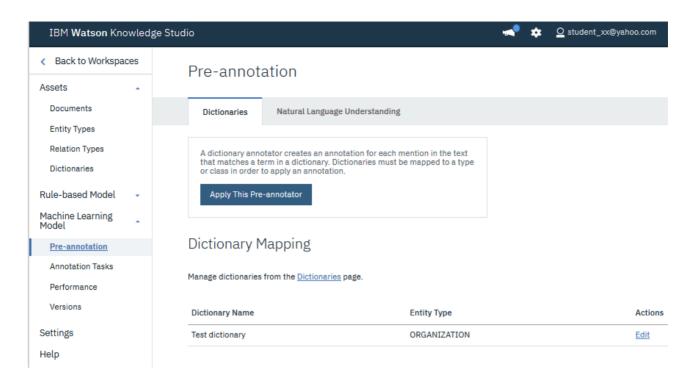
In this part, you will learn how to use a dictionary-based annotator to pre-annotate documents in Knowledge Studio. Pre-annotating documents is an optional step. However, it is a worthwhile step because it makes the job of human annotators easier later.

### Perform the following steps:

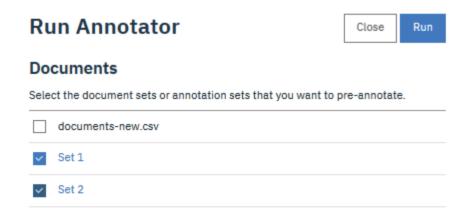
- \_\_ 1. Within your workspace, click Assets > Dictionaries.
  The dictionary Test Dictionary that was created in Part 4 Adding a dictionary opens.
- \_\_ 2. From the Entity type list, select the ORGANIZATION entity type to map it to the dictionary Test dictionary. Inspect the entries to ensure that they all represent organizations. The ORGANIZATION entity type is part of the type system that was created in Part 3 Creating a type system.



\_\_ 3. On the Machine Learning Model > Pre-annotation > Dictionaries tab, click Apply This Pre-annotator.



\_\_ 4. Select the annotation sets that you created named Set 1 and Set 2 and then click Run



5. A notification reporting the annotator completion results is displayed. The documents in the selected sets are pre-annotated by using the dictionary that you created.



# Part 8. Creating an annotation task

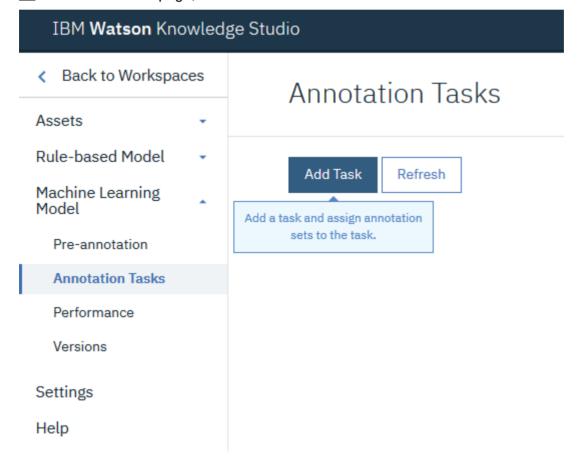
Before human annotators can begin adding annotations to documents, the annotation process manager must create an annotation task.

The annotation task specifies which documents are to be annotated. To compare how well the human annotators perform, and to see how consistently they apply the annotation guidelines, you must include at least two human annotators in the task. In addition, some percentage of documents must occur in all of the annotation sets that you add to the task (you specify the overlap percentage when you create the annotation sets).

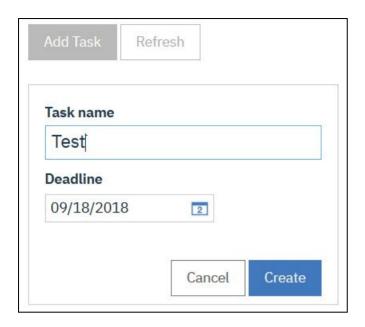
In this part, you will learn how to use annotation tasks to track the work of human annotators in Knowledge Studio.

Perform the following steps:

- 1. Within your workspace, click Machine Learning Model > Annotation Tasks.
- \_\_ 2. On the Tasks page, click Add Task.



- \_\_ 3. Specify the details for the task:
  - In the Task name field, enter Test.
  - In the **Deadline** field, select a date in the future.
- \_\_ 4. Click **Create**.



\_\_ 5. Select the annotation sets that you created previously Set 1 and Set 2.
Selecting both annotation sets specifies that both sets must be annotated by their assigned human annotators to complete this task.

# Add Annotation Sets to the Task

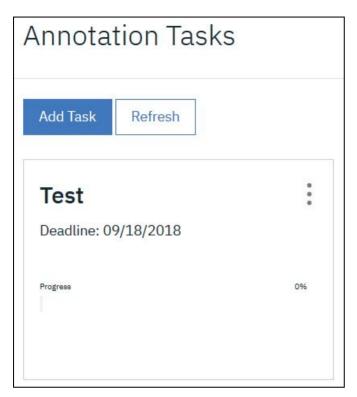




6. Click Create Task.

The Test annotation task is added.

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\_\_ 8. Click **Test**. As human annotators begin annotating documents, you can open tasks to see their progress.



# Part 9. Annotating documents

When a human annotator annotates a document, the document is opened in the *ground truth editor*. The ground truth editor is a visual tool that human annotators use to apply labels to text.

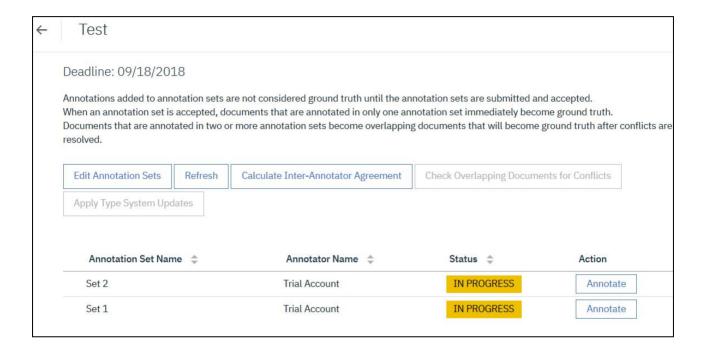
The goal of human annotation is to label mentions, relations, and coreferenced mentions so that the machine learning model can be trained to detect these patterns in unseen text.

<u>Information:</u> Ground truth is the collection of vetted data that is used to adapt Watson to a particular domain. In Knowledge Studio, human annotators, who are typically experts in the subject matter of the target domain, play a major role in determining ground truth.

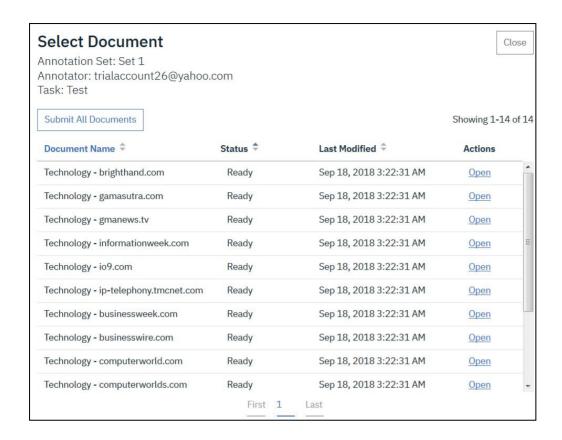
In this part, you will learn how to use the *ground truth editor* to annotate documents in Knowledge Studio.

### Perform the following steps:

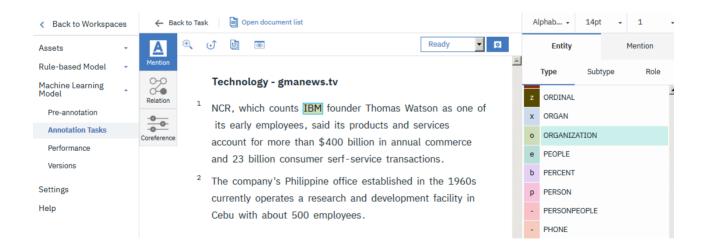
- \_\_\_ 1. Within your workspace, click Machine Learning Model > Annotation Tasks.
- \_\_\_ 2. Open the *Test* annotation task you just created in Part 8 Creating an annotation task.
- \_\_ 3. Click **Annotate** for one of the assigned annotation sets.



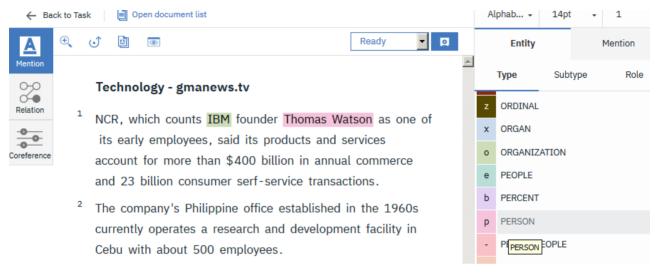
\_\_ 4. From the list of documents, find the **Technology - gmanews.tv** document and open it.



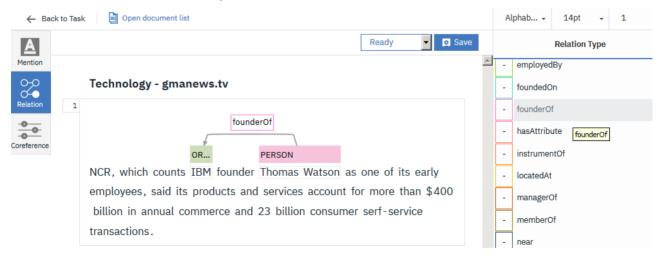
Notice in the following figure that the term *IBM* was already annotated with the *ORGANIZATION* entity type. This annotation was added by the dictionary pre-annotator that was applied in Part 7 Pre-annotating with a dictionary-based annotator. This pre-annotation is correct, so it does not need to be modified (colors may be different for you).



- Annotate a mention.
  - \_\_ a. Click the Entity tab.
  - \_\_\_ b. In the document body, select the text *Thomas Watson.*
  - \_\_ c. In the list of entity types, click PERSON. The entity type PERSON is applied to the selected mention.



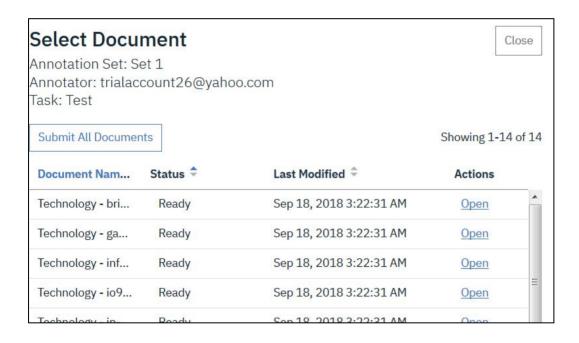
- Annotate a relation.
  - Click the Relation tab.
  - \_\_\_ b. Select the *Thomas Watson* and *IBM* mentions (in that order). To select a mention, click the entity type label above the text.
  - \_\_ c. In the list of relation types, click **founderOf**. The two mentions are connected with a *founderOf* relationship.



7. From the status menu, select **Completed**, and then click **Save**.



- \_\_ 8. Repeat the previous steps to create more annotations from the documents in the set to practice the annotation process.
- 9. Click Open document list to return to the list of documents for this task and click Submit All Documents to submit the documents for approval.

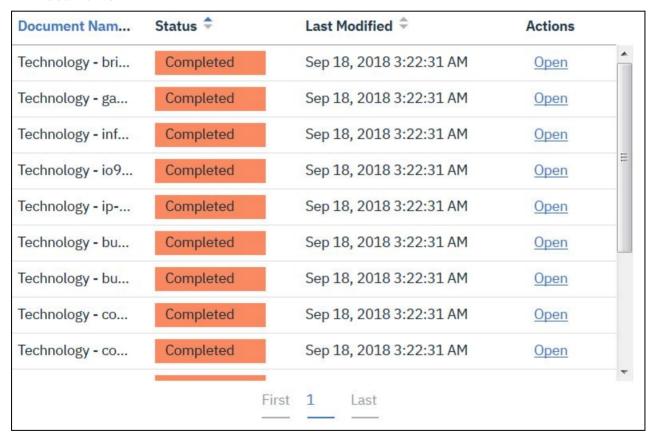


- \_\_ 10. At the confirmation prompt click **OK**.
- \_\_\_ 11. Close this annotation set, and then open the other annotation set in the *Test* task.
- \_\_ 12. Repeat the same annotations done in the previous example in the *Technology* gmanews.tv document, except this time, use the employedBy relation instead of the founderOf relation, when creating the relation annotation.

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13. After you complete the annotations for the second annotation set, click Submit All Documents.

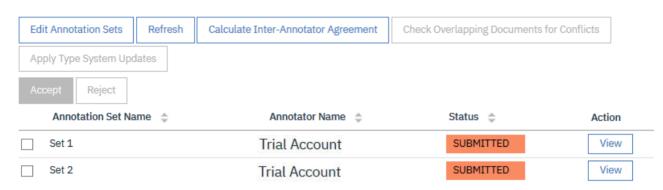


Both annotation sets should now be in status SUBMITTED.

### Test

### Deadline: 10/11/2018

Annotations added to annotation sets are not considered ground truth until the annotation sets are submitted and accepted. When an annotation set is accepted, documents that are annotated in only one annotation set immediately become ground truth. Documents that are annotated in two or more annotation sets become overlapping documents that will become ground truth after conflicts a resolved.



# Part 10. Analyzing inter-annotator agreement

To determine whether different human annotators are annotating overlapping documents consistently, review the inter-annotator agreement (IAA) scores.

Knowledge Studio calculates IAA scores by examining all overlapping documents in all document sets in the task, regardless of the status of the document sets. The IAA scores show how different human annotators annotated mentions, relations, and coreference chains. It is a good idea to check IAA scores periodically and verify that human annotators are consistent with each other.

At the end of Part 9 Annotating documents, the human annotators submitted all the document sets for approval. If the inter-annotator agreement scores are acceptable, you can approve the document sets. If you reject a document set, it is returned to the human annotator for improvement.

In this part, you will learn how to compare the work of multiple human annotators in Knowledge Studio.

Perform the following steps:

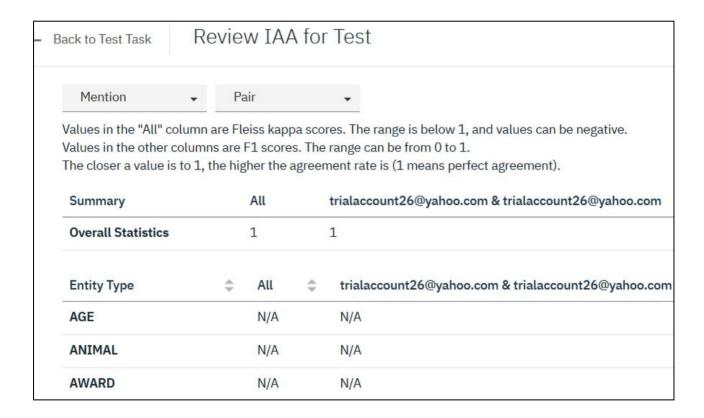
\_ 1. Within your workspace, click Machine Learning Model > Annotation Tasks, and click the Test task.

In the **Status** column, you can see that the document sets are submitted.

\_\_ 2. Click Calculate Inter-Annotator Agreement.



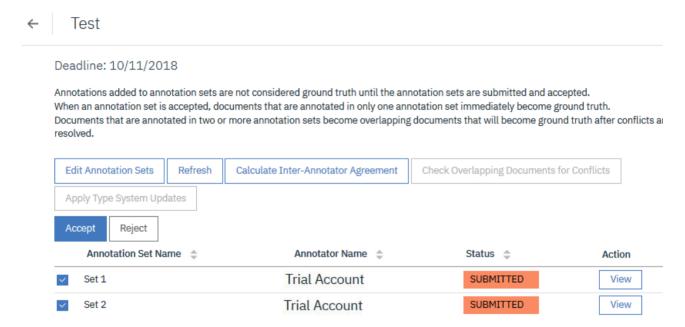
\_\_ 3. View IAA scores for mention, relations, and coreference chains by clicking the first menu. You can also view agreement by pairs of human annotators. You can also view agreement by specific documents. In general, aim for a score of 0.8 out of 1, where 1 means perfect agreement. Because you annotated only two entity types in this exercise, most of the entity type scores are N/A (not applicable), which means no information is available to give a score.



- 4. Ensure that **Mention** is selected and scroll through the list and check the score for the ORGANIZATION and PERSON entities. You will find that they have a score of 1 to show complete agreement.
- \_\_ 5. Select Relation and locate the employedBy and founderOf relations. You will find a score of 0 to show complete disagreement.

- \_\_\_ 6. After you review the scores, you can decide whether you want to approve or reject document sets that are in the SUBMITTED status. Take one of these actions:
  - If the scores are acceptable for an annotation set, select the check box and click **Accept**. Documents that do not overlap with other document sets are promoted to ground truth. Documents that do overlap must first be reviewed through adjudication (discussed in Part 11) so that conflicts can be resolved.
  - If the scores are not acceptable for an annotation set, select the check box and click
    Reject. The document set needs to be revisited by the human annotator to improve the
    annotations.

For this exercise, click **Back to Test Task**, make sure both annotation sets are selected, and then click **Accept** to accept both document sets.



At the Confirmation prompt, click **OK**.

When you evaluate the inter-annotator agreement scores, you can see how different pairs of human annotators annotated the same document. If the inter-annotator agreement score is acceptable, you accept the document set, otherwise, you reject it to be revisited by the human annotator for improvements.

# Part 11. Adjudicating conflicts in annotated documents

When you approve a document set, only the documents that do not overlap with other document sets are promoted to ground truth. If a document is part of the overlap between multiple document sets, you must adjudicate any annotation conflicts before the document can be promoted to ground truth.

In this part, you will learn how to adjudicate conflicts in documents that overlap between document sets in Knowledge Studio.

Perform the following steps:

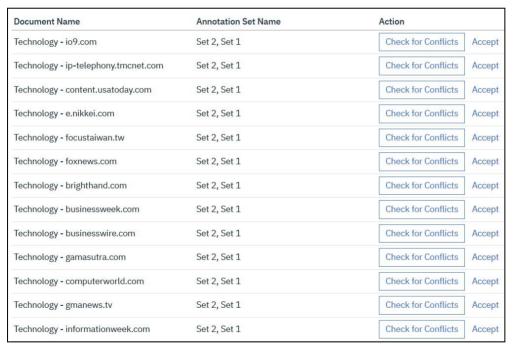
\_\_ 1. Within your workspace, click **Machine Learning Model** > **Annotation Tasks**, and click the *Test* task.



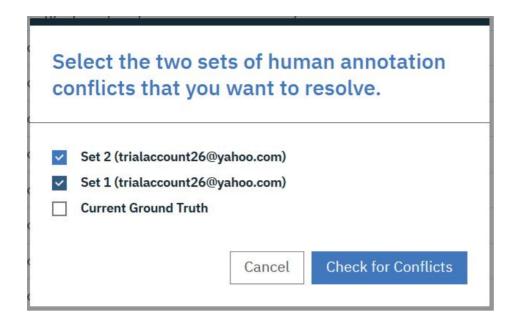
\_\_ 2. Click Check Overlapping Documents for Conflicts.

You can see the overlapping documents that were annotated by more than one human annotator. In this exercise, all documents overlap therefore the overlap percentage is 100%.

\_\_ 3. Because the exercise instructed you to create a conflicting relation for the *Technology - gmanews.tv* document, find that document in the list and click **Check for Conflicts**.

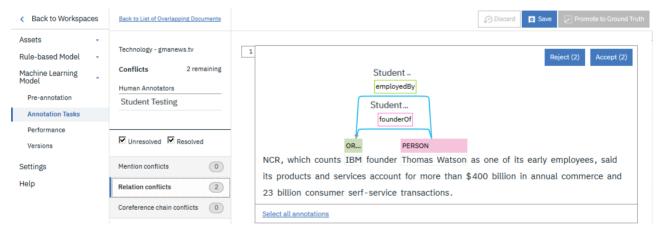


4. Select the two conflicting annotation sets and click Check for Conflicts.

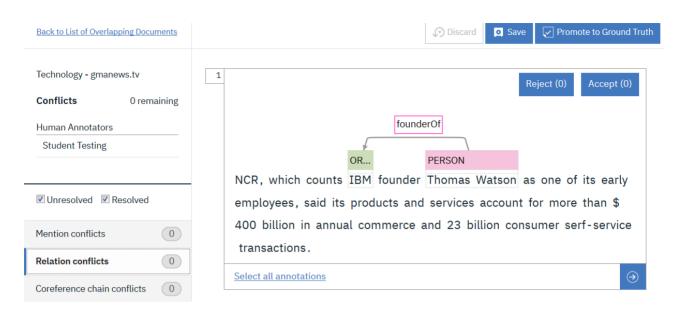


Adjudication mode opens. In adjudication mode, you can view overlapping documents, check for conflicts, and remove or replace annotations before you promote the documents to ground truth.

\_\_ 5. Select **Relation conflicts**, to accept the *founderOf* relation, and reject the *employedBy* relation.



- \_\_ a. Select the founderOf relation and click Accept.
- \_\_\_ b. Select the **employedBy** relation and click **Reject**.



- 6. Click Promote to Ground Truth.
- \_\_\_ 7. Click **Check for Conflicts** and **Promote to Ground Truth** for all remaining documents in the list.
- \_\_\_ 8. Click Back to Test Task.

After you resolve all annotation conflicts and promote the documents to ground truth, the status of the annotation sets is COMPLETED. And now you can use the documents to train the machine learning model.



# Part 12. Creating a machine learning model

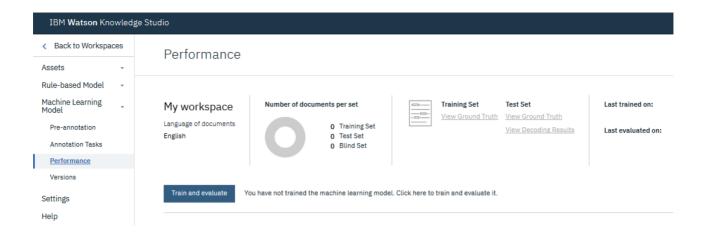
When you create a machine learning model, you select the document sets that you want to use to train it. You also specify the percentage of documents that are to be used as training data, test data, and blind data. Only documents that became ground truth through approval or adjudication can be used to train the machine learning model.

In this part, you will learn how to create a machine learning model in Knowledge Studio.

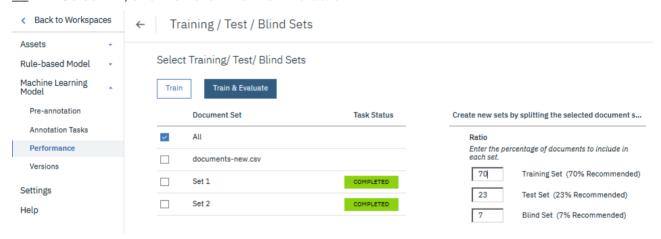
Perform the following steps:

\_\_ 1. Click Machine Learning Model > Performance > Train and evaluate.

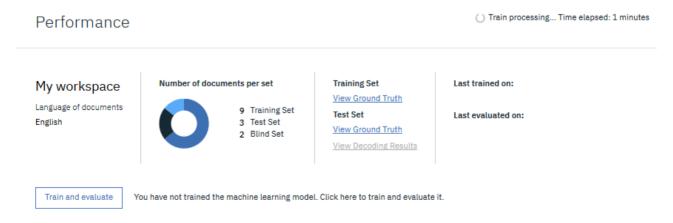
© Copyright IBM Corp. 2018 34



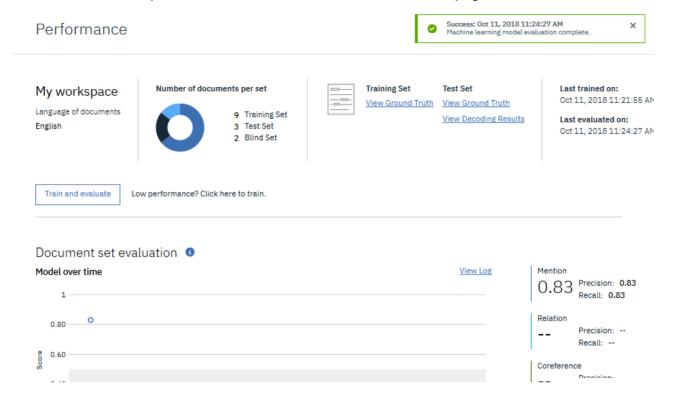
\_ 2. Select All, and then click Train & Evaluate.



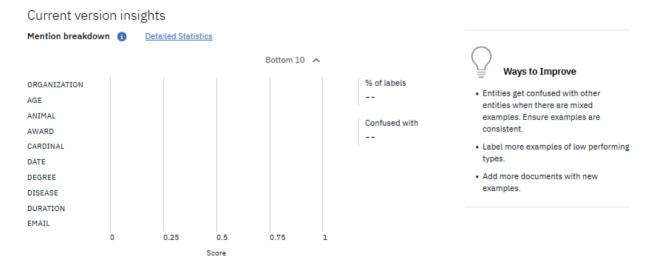
\_\_ 3. Training might take more than ten minutes, or even hours, depending on the number of human annotations and the number of words in all the documents. The Train processing status is displayed.



4. At the end of this step, you receive a notification indicating that the machine learning model evaluation is completed. Scroll-down to review the Performance page.



\_\_ 5. Click the Detailed Statistics links above each of the graphs to see detailed information about the machine learning model performance. On these Statistics pages, you can view the scores for mentions, relations, and coreference chains by using the radio buttons.



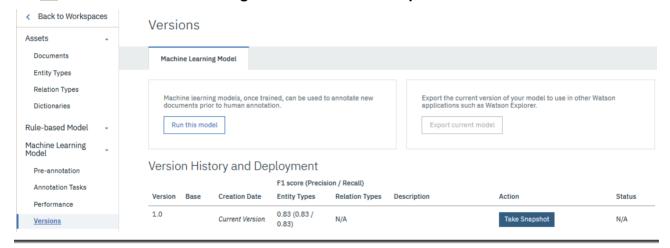
- To view the Training / Test / Blind Sets page, click the Train and evaluate button.
- To see the documents that human annotators worked on, click View Ground Truth.

- To see the annotations that the trained machine learning model created on that same set of documents, click View Decoding Results.
- To view details about the precision, recall, and F1 scores for the machine learning model, click the **Performance** page.
- You can analyze performance by viewing a summary of statistics for entity types, relation types, and coreference chains.
- \_\_ 9. When you are satisfied with the performance of the model, you can export the current version of the machine learning model to use it in other Watson services such as Watson Discovery, and Watson Natural Language Understanding, or Watson software such as Watson Explorer.

This feature enables your applications to use the deployed machine learning model to enrich the insights that you get from your data to include the recognition of concepts and relations that are relevant to your domain and analyze semantic features of text input, including entities and relations.

To export a version of the machine learning model:

\_\_ a. Click Machine Learning > Versions > Take Snapshot.



**Note:** The Export current model option is not available for Lite plans.

\_\_ b. Enter a description (optional) and click **OK**.

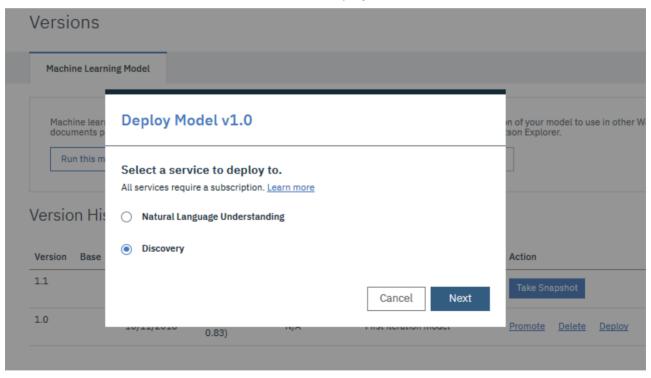
#### Take a snapshot

Create a snapshot of the current annotator component artifacts. This action creates a new version of the model, and keeps a copy of the artifacts that were used to build it.

Description (Optional):



- \_\_ c. Choose the version of the model that you want to deploy.
- \_\_ d. Click Deploy.
- \_\_ e. Select the Watson service instance to deploy to.



\_\_ f. For this exercise, just click **Cancel**. You will deploy a Watson Studio machine learning model to Discovery in a future exercise.

In this part, you created a machine learning model, trained it, and evaluated how well it performed when annotating test data and blind data. By exploring the performance metrics, you can identify ways to improve the accuracy of the machine learning model.

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# Optional exercise: Creating a rule-based model

#### **Estimated time:**

00:30

#### Overview

This exercise helps you understand how to create a rule-based model that you can use to find text patterns that you define in documents.

#### **Objectives**

After completing this exercise, you should be able to:

- Create classes
- Add documents for defining rules
- · Associate dictionaries with classes
- Define regular expressions to capture sequences of characters
- Define rules

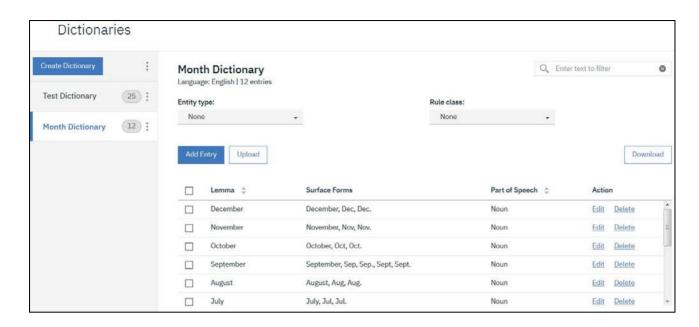
#### Introduction

You will build a model that can find text in documents that matches the pattern month day, year. For example, the model would find the date reference *May 1, 2010*. Before you define the rule pattern itself, you will create artifacts that will help you build the pattern, including a dictionary class that recognizes month mentions and a regular expression class that recognizes year mentions in text.

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# **Exercise instructions**

In this	exercise you will complete the following tasks:
1.	Add a dictionary of months
2.	Add sample documents
3.	Create classes.
4.	Associate a dictionary with a class.
5.	Find class annotations in documents.
6.	Define a regular expression.
7.	Define a rule.
8.	Create a rule-based model.
In this contair perforr	1. Adding a dictionary of months  part you will add a dictionary to your workspace in Knowledge Studio. The dictionary his terms related to the months of the year. This task is similar to the task that you need in Part 4 Adding a dictionary but this is a different dictionary related to the months of the Continue using the same workspace in Knowledge Studio.
•	m the following steps:
1. dic	Download the file dictionary-items-month.csv to your computer. This file contains tionary terms in CSV format, suitable for uploading into a Knowledge Studio dictionary.
2.	Click Assets > Dictionaries.
3.	Click Create Dictionary to add a dictionary.
4. dic	In the <b>Name</b> field, type <b>Month dictionary</b> and click <b>Save</b> to create the dictionary. The new tionary is created and automatically opened for editing.
5.	In the dictionary pane, click <b>Upload</b> .
6.	Select the file <b>dictionary-items-month.csv</b> from your computer and click <b>Upload</b> .
	The terms from the file are imported into the dictionary as shown in the figure.

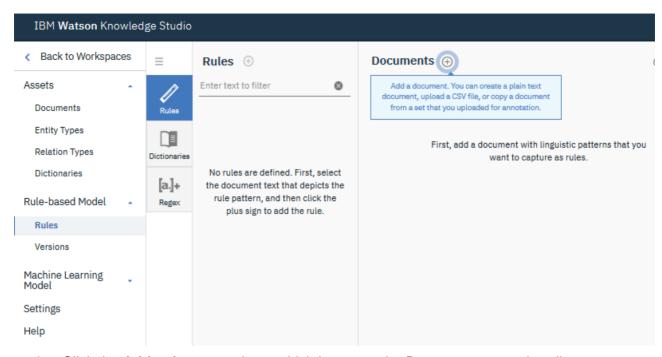


#### Part 2. Adding sample documents

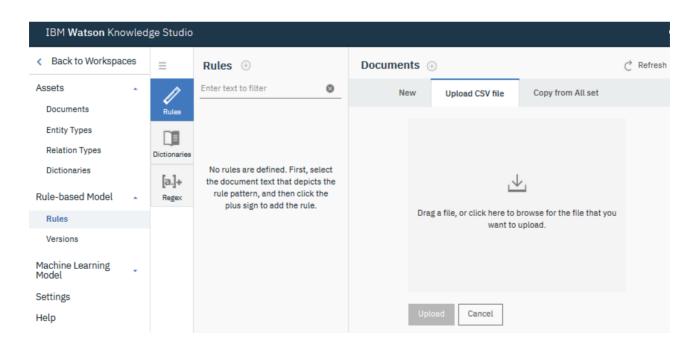
In this part, you will learn how to add documents with linguistic patterns that illustrate the types of rules you want to define. In this exercise, the documents should include dates in the format that you want to capture.

Perform the following steps:

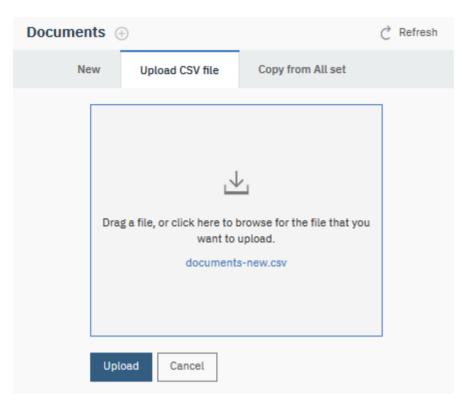
- \_\_ 1. Download the <u>documents-new.csv</u> file to your computer. This file contains example documents suitable for uploading. These are the same document that were used before.
- \_\_ 2. Click Rule-based Model > Rules.



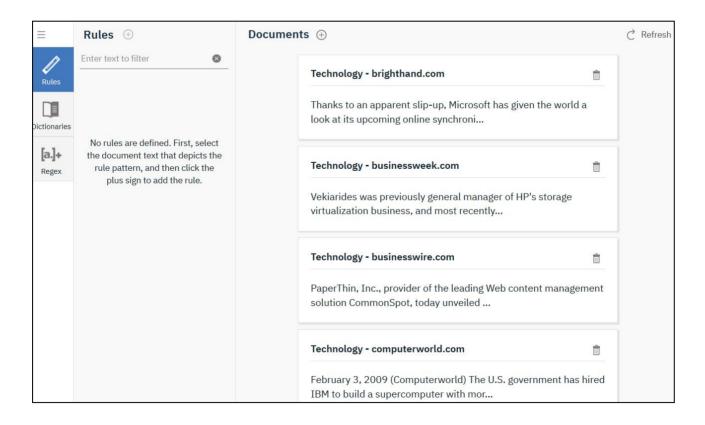
- \_\_ 3. Click the **Add a document** icon, which is next to the **Documents** page heading.
- \_\_ 4. Click the **Upload CSV file** tab.



\_\_\_ 5. Click to browse for the *documents-new.csv* file that you downloaded to your computer earlier, and then click **Upload**.



\_\_\_6. A set of documents will be displayed in the main Documents page as shown in the figure.

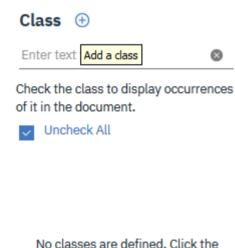


#### Part 3. Creating classes

When you construct a rule, you use classes to represent types of information. As you build rules, you can define intermediate classes that are used only to build other more complex classes.

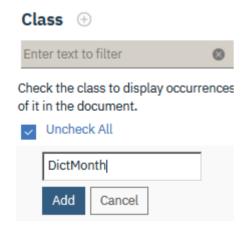
In this part, you will learn how to define classes that you will use later when you define a rule. Perform the following steps:

\_\_ 1. From the **Rules** page of your workspace, click the **Add a class** icon next to the **Class** heading in the right panel as shown in the figure.

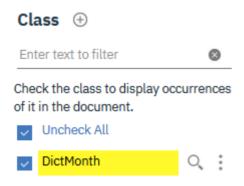


plus sign to add a class.

\_\_ 2. Enter **DictMonth** as the class name, and then click **Add**.



\_\_ 3. The new class is displayed in the Class panel.

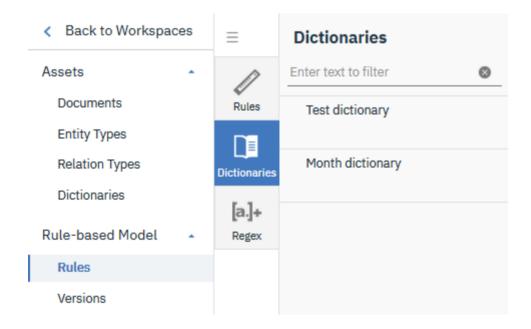


### Part 4. Associating a dictionary with a class

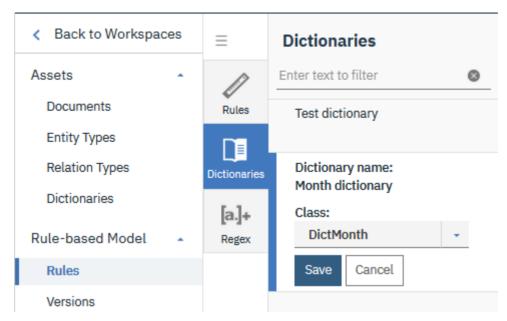
In this part, you will learn how to use a dictionary in the rule editor.

Perform the following steps:

\_\_ 1. Click Rule-based Model > Rules, and then click the Dictionaries tab.



- \_\_ 2. Select **Month dictionary** that you created previously.
- \_\_ 3. From the Class list, select the DictMonth class and then click Save.



The class is now associated with the dictionary.



For documents that are associated with the rule editor, any references to terms in the dictionary are annotated as DictMonth class mentions.

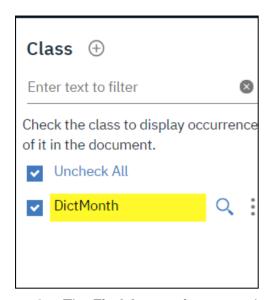
## Part 5. Finding class annotations in documents

In this part, you will learn how to find class annotations in rule editor documents.

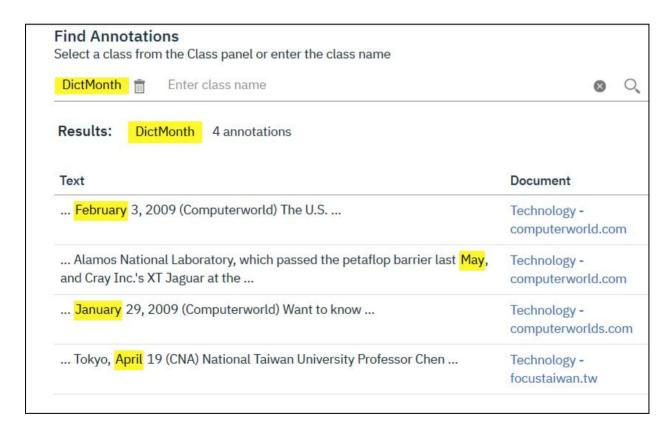
Perform the following steps:

\_\_ 1. Select Rule-based Model > Rules.

From the Class panel, find the **DictMonth** class that you defined earlier, and click the **Search** annotations in documents Icon beside the class name.



\_\_\_ 2. The **Find Annotations** page is displayed and shows all the documents that contain text references to months.



\_\_ 3. Click the **Technology - computerworld.com** document to view the full document. Notice that the text *February* is highlighted, which means it was annotated as a mention of the *DictMonth* class. If you scroll you will notice that *May* is highlighted also.

## Technology - computerworld.com

February 3, 2009 (Computerworld) The U.S. government has hired IBM to build a supercomputer with more power than all the supercomputers on the Top500 supercomputer list combined.

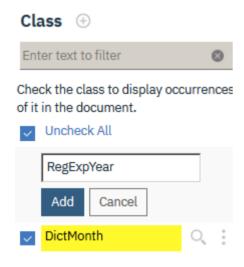
#### Part 6. Define a regular expression

At this point, you can capture month mentions by using the dictionary that you uploaded earlier and associated a class with it.

In this part you will define a regular expression to capture year patterns like 2009.

Perform the following steps:

- \_\_ 1. From the Rules page, click the Add a class icon entry next to Class from the right panel.
- 2. Enter RegExpYear as the class name and click Add.



\_\_ 3. Click the **Regex** tab, and then click the **Create a regular expression** icon next to the Regular Expressions heading.



- \_\_\_ 4. Click Add Entry.
- \_\_ 5. In the **Regular Expression** field, enter the following expression, which finds years between 1900 and 2099:

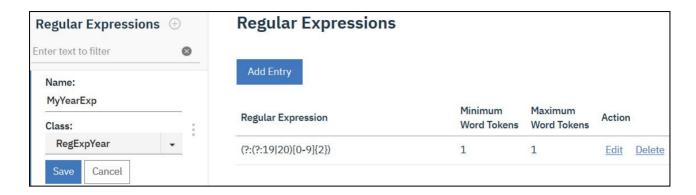
(?:(?:19|20)[0-9]{2})

- 6. Set Minimum Word Tokens to 1 and Maximum Word Tokens to 1.
- \_\_ 7. Click **Add** to save the regular expression.

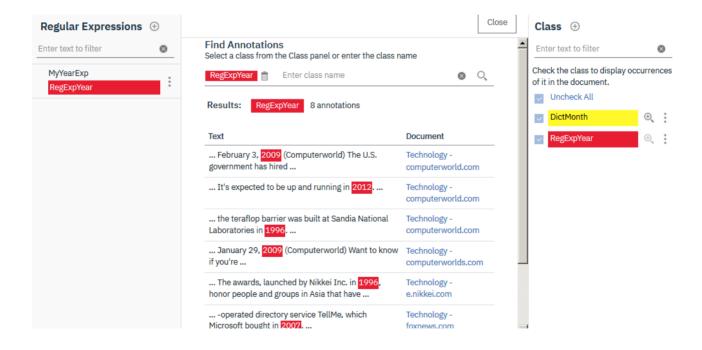
## **Regular Expressions**



- \_\_ 8. Enter MyYearExp as the regular expression name, and then, from the Class menu, select the RegExpYear class that you defined earlier.
- \_\_ 9. Click **Save**.



- \_\_ 10. After you save the regular expression, it is automatically applied to the sample documents. Any text strings that follow the pattern that you defined in the regular expression are annotated as mentions of the RegExpYear class.
- \_\_\_ 11. To check whether the expression you defined is capturing time occurrences correctly, you can search for mentions. Click the **Search annotations in documents** icon beside the class name *RegExpYear* in the Class panel.
- \_\_\_ 12. The **Find Annotations** page is displayed. Occurrences of year mentions are highlighted in the sample documents in which they occur.

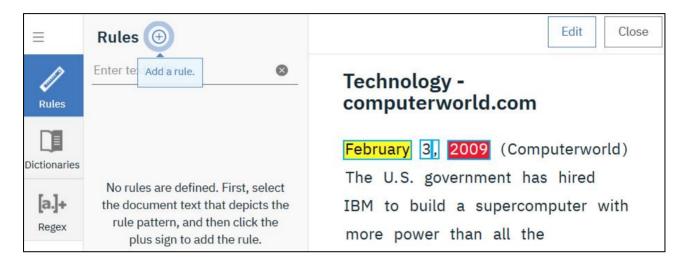


## Part 7. Defining a rule

You already defined a dictionary-based class for annotating month mentions. You also defined a regular expression that finds numeric values which represent a year. In this part, you will define a rule that captures the sequence of a month followed by a number, a comma, and then a year. You will define a rule for date expressions like *September 21, 2016*.

#### Perform the following steps:

- \_\_ 1. Select **Rule-based Model** > **Rules** and open the *Technology computerworld.com* document.
- \_\_ 2. Select the text *February 3, 2009* in the document. Make sure you select the comma, too as shown in the figure.



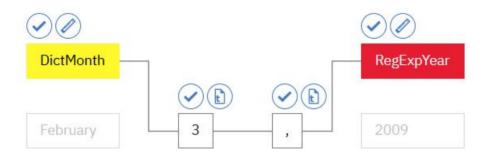
3. Click the **Add a rule** icon.

The rule editor shows a depiction of the rule pattern that you identified.

The text *February 3, 2009* is visible. A solid line that connects the cells in the depiction identifies which cells are currently part of the pattern as in the figure.

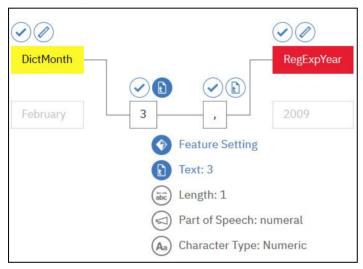
- The DictMonth class is part of the rule pattern instead of the text February. This selection is preferred because you want the model to find any month that is annotated by the DictMonth class as the first token in the date pattern instead of the text February only.
- At the end of the rule, the year 2009 is already annotated as being a mention of the RegExpYear class. The RegExpYear class is part of the rule pattern instead of the number 2009. This selection is also preferred because you want the model to find any year that is annotated by the RegExpYear class as the last token in the date pattern instead of the specific text 2009 only.
- The number 3 and the comma (,) after it are shown as the second and third tokens in the pattern. As the pattern is currently specified, the model will find only occurrences of dates that specify the 3rd day of a month. We want the model to find dates that specify any day of the month, so next you will change the feature settings for the day token.

Click a word or annotation to adjust the conditions by which it participates in the rule pattern.



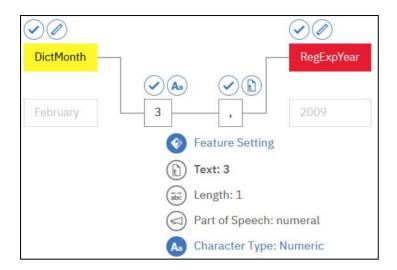
\_\_\_ 4. Above the day **3** cell, click the **Text** icon to open the feature settings for the token.

Currently, the rule is set to match the exact text, **3**. Instead, we want it to match any number.



\_\_\_ 5. Change the feature setting to be numeric by selecting **Character Type : Numeric**, and then clearing the selection, **Text : 3**.

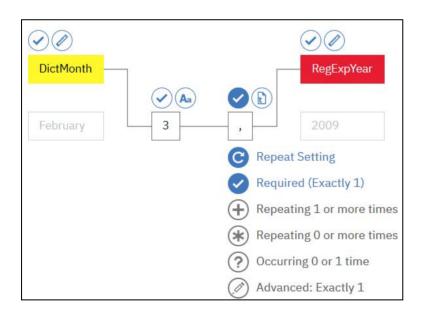
You changed the definition for the number **3** cell. The **Character Type** icon indicates that instead of requiring the number to be equal to 3 exactly, it can be any number.



\_\_\_ 6. Do not change any settings for the comma token.

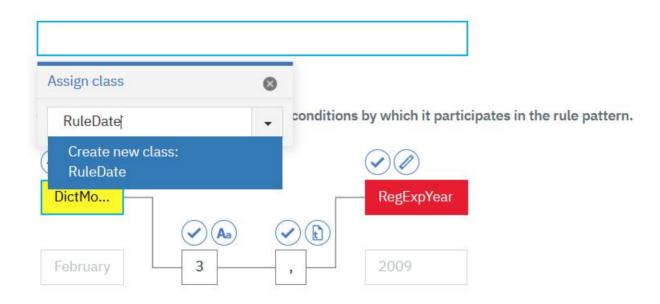
You want the third token in the pattern to be a comma, so the current feature setting of **text**:, is appropriate.

In addition to a feature setting, each token has a repeat setting. The repeat setting specifies how many times the token can be repeated in the text for it to match the pattern. The current repeat setting of **Required (Exactly 1)** is appropriate.

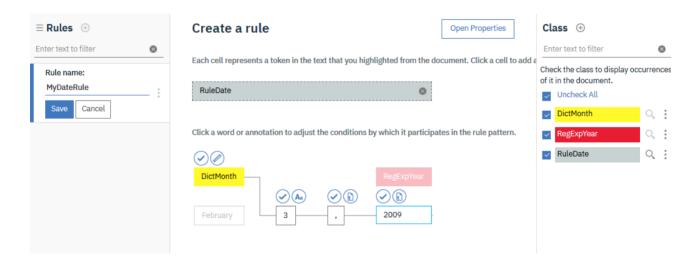


\_\_ 7. Assign a class to represent the pattern DictMonth + numeric token + comma + RegExpYear.

Notice the four empty cells that represent the four tokens that you selected from the document. To select all the cells, select the first cell, and then press **Shift** + click each additional cell. Enter **RuleDate** as the class name, and then click it to create the new class.

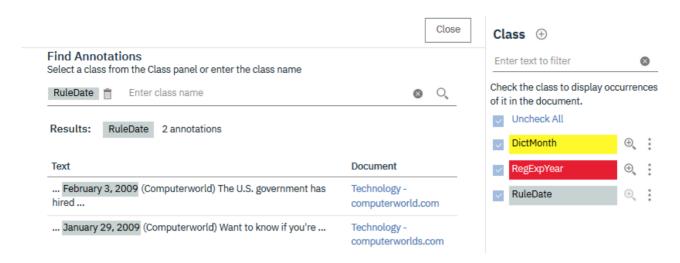


\_\_\_ 8. In the Rule name field, enter MyDateRule and click Save.



After you save the rule, it is automatically applied to the sample documents.

\_\_\_ 9. You can search for all occurrences of RuleDate class mentions in the sample documents by clicking the **Search annotation in documents** icon next to the RuleDate class from the Class panel. It is a good practice to check that all dates are captured properly to confirm that you defined the pattern correctly as in the figure.



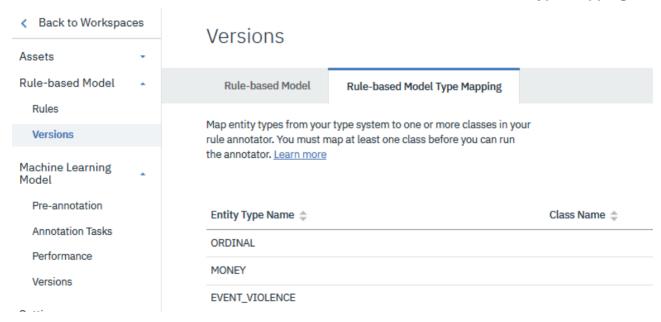
#### Part 8. Creating a rule-based model

After defining rules, you can create a rule-based model. The rule-based model can be run as a pre-annotator only on documents that were not already annotated by humans.

In this part, you will learn how to create a rule-based model.

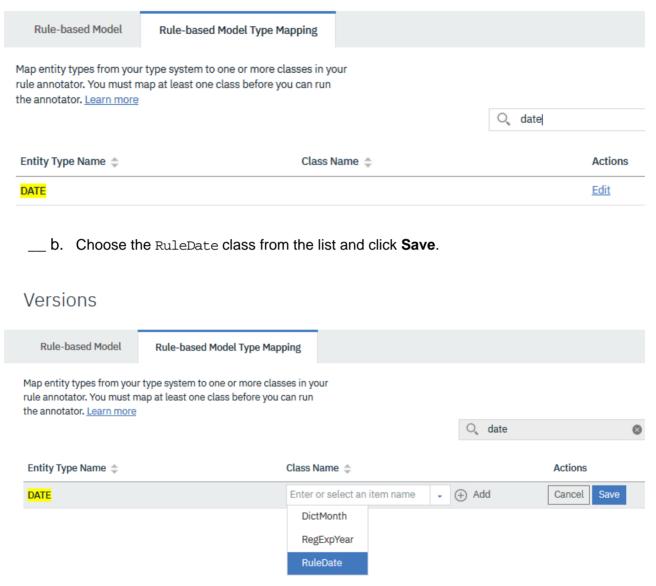
Perform the following steps:

\_\_ 1. Select Rule-based Model > Versions and click the Rule-based model type mapping tab.



- \_\_\_ 2. Map the RuleDate class to the DATE entity from the type system:
  - \_\_ a. Find the **DATE** entity (use the filter to find it quickly) and click **Edit**.

#### Versions



\_\_ 3. To pre-annotate document sets or annotation sets with the rule-based model, select the **Rule-based Model** tab and click **Run this model**.

<u>Attention:</u> To be able to run the rule-based model successfully, run the rule-based model as a preannotator only on documents that were not already annotated by humans, so in order to try this out you will need to add new documents and try running the newly created rule-based model on it.

## **Exercise review and wrap-up**

In this exercise, while learning about Knowledge Studio, you created a workspace and added artifacts to it. You then created a machine learning model, trained it, and evaluated how well it performed when annotating test data and blind data. By exploring the performance metrics, you can identify ways to improve the accuracy of the machine learning model. You created a custom machine learning model that you can use with other Watson services.

By completing this exercise, you learned about the following concepts:

- Workspaces
- Type systems
- Dictionaries
- Document sets
- Machine learning models
- Human annotation tasks
- Inter-annotator agreement and adjudication

If you performed the optional exercise, you created a rule-based model.

By completing the optional exercise, you learned about the following concepts:

- Classes
- Regular expressions
- Rules
- Ruled-based models