

ECOLE SUPÉRIEURE PRIVÉE D'INGÉNIERIE ET DE TECHNOLOGIES

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Stage d'ingénieur

DIPLÔME NATIONAL D'INGÉNIEUR

SPÉCIALITÉ: DATA SCIENCE

Projet IA et Cognition :

PROJECT MANAGEMENT BODY OF KNOWLEDGE - PMBOK

Réalsié par: - LABIDI Ons

- FARAH Bilel

- DJEBBY WIEM

- LAMINE Kais

- CHEBBI Chaima

- SLIMANI Taoufik











Extraction du texte à partir d'un document PDF :

Importation des bibliothèque :

```
# Useful Libraries
from pdf2image import convert_from_path
from pytesseract import image_to_string
from PIL import Image
import csv
import re
```

Transformer le PDF en image ensuite les images en texte en utilisant Pytesseract :

```
def convert_pdf_to_img(pdf_file):
         return convert_from_path(pdf_file)
6 def convert_image_to_text(file):
8
         text = image_to_string(file)
10
11
def get_text_from_any_pdf(pdf_file):
15
         images = convert_pdf_to_img(pdf_file)
16
         final text :
         for pg, img in enumerate(images):
18
             final_text += convert_image_to_text(img)
#print("Page n°{}".format(pg))
#print(convert_image_to_text(img))
19
20
23
        return final text
```

Remplacer certains caractères par un espace vide :

```
textextract=textextract.replace("0","")
textextract=textextract.replace("0","")
textextract=textextract.replace("0","")
textextract=textextract.replace("0","")
textextract=textextract.replace("0","")
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textextract=textextract.replace("1","")
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textextract=textextract.replace("1","")
textextract=textextract.replace("1","")
textextract=textextract.replace("1","")
textextract=textextract.replace("71","souschapitre")
textextract=textextract.replace("71","souschapitre")
textextract=textextract.replace("74","souschapitre")
textextract=textextract.replace("74","souschapitre")
textextract=textextract.replace("74","souschapitre")
textextract=textextract.replace("74","souschapitre")
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textextract=textextract.replace("74","souschapitre")
textextract=textextract.replace("74","souschapitre")
textextract=textextract.replace("74",")
textextract=textextract.replace("74",")
textextract=textextract.replace("8",")
textextract=textextract.replace("8",")
textextract=textextract.replace("6",")
textextract=textext
```

Extraction des figures :

Extraction des titres et les mettre dans un data frame appelé 'CONCEPT' :

```
Entrée [10]:

Titre = re.findall(r"[0-9]."[A-Z]\n", textextract)
Titre.sort()
Titre.sort()
Titre.sort()
Titre.sort()

"5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n',

"5.1.1.1 PROJECT CHANTER\n',

"5.1.1.1 PROJECT CHANTER\n',

"5.1.1.3 ENTERPISE ENVIRONMENTAL FACTORS\n',

"5.1.1.3 ENTERPISE ENVIRONMENTAL FACTORS\n',

"5.1.1.2 PLAN SCOPE MANAGEMENT: TOOLS AND TECHNIQUES\n',

"5.1.2.1 EXPERT JUDGEMENT\n',

"5.1.2.2 DATA ANALYSIS\n',

"5.1.2.3 MEETINGS\n',

"5.1.3.1 SCOPE MANAGEMENT: OUTPUTS\n',

"5.1.3.1 SCOPE MANAGEMENT: OUTPUTS\n',

"5.1.3.1 SCOPE MANAGEMENT PLAN\n',

"5.1.3.2 REQUIREMENTS\n',

"5.1.3.1 PROJECT CHARTER\n',

"5.2.1.1 PROJECT CHARTER\n',

"5.2.1.1 PROJECT CHARTER\n',

"5.2.1.2 PROJECT DOCUMENTS\n',

"5.2.1.3 PROJECT DOCUMENTS\n',

"5.2.1.4 BUSIN DOCUMENTS\n',

"5.2.1.5 AGREEMENTS\n',

"5.2.1.6 ENTERPISE ENVIRONMENTAL FACTORS\n',

"5.2.1.7 GRANTAZTIONAL PROCE AETS\n',

"5.2.2.1 EXPERT JUDGEMENT'S: TOOLS AND TECHNIQUES\n',

"5.2.2.2 DATA GATHERING\n',

"5.2.2.2 DATA GATHERING\n',

"5.2.2.3 DATA ANALYSIS\n',

"5.2.2.4 DECISION MAKING\n',

"5.2.2.5 DATA REPRESENTATION\n',

"5.2.2.5 DATA REPRESENTATION\n',
```

Définir le type de chaque concept :

Out[12]:

```
Entrée [12]: for i in range(0,90):
    if ((df.loc[i,['Concept']].str.contains('INPUTS')).bool()):
        df.loc[i,['TYPE']]='INPUTS'
    elif ((df.loc[i,['Concept']].str.contains('TOOLS AND TECHNIQUES')).bool()):
        df.loc[i,['TYPE']]='TOOLS AND TECHNIQUES'
    elif ((df.loc[i,['Concept']].str.contains('OUTPUTS')).bool()):
        df.loc[i,['TYPE']]='OUTPUTS'

df.head(51)
```

: _	Concept	TYPE
	5.1 PLAN SCOPE MANAGEMENT\n	NaN
	5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n	INPUTS
	2 5.1.1.1 PROJECT CHARTER\n	NaN
	5.1.1.2 PROJECT MANAGEMENT PLAN\n	NaN
	5.1.1.3 ENTERPRISE ENVIRONMENTAL FACTORS\n	NaN
	5.1.1.4 ORGANIZATIONAL PROCE AETS\n	NaN
	5.1.2 PLAN SCOPE MANAGEMENT: TOOLS AND TECHNIQ	TOOLS AND TECHNIQUES
	5.1.2.1 EXPERT JUDGMENT\n	NaN
	5.1.2.2 DATA ANALYSIS\n	NaN
	5.1.2.3 MEETINGS\n	NaN
1	5.1.3 PLAN SCOPE MANAGEMENT: OUTPUTS\n	OUTPUTS
1	5.1.3.1 SCOPE MANAGEMENT PLAN\n	NaN
1	2 5.1.3.2 REQUIREMENTS MANAGEMENT PLAN\n	NaN
1	5.2 COLLECT REQUIREMENTS\n	NaN
1	5.2.1 COLLECT REQUIREMENTS: INPUTS\n	INPUTS
1	5.2.1.1 PROJECT CHARTER\n	NaN
1	5.2.1.2 PROJECT MANAGEMENT PLAN\n	NaN
1	5.2.1.3 PROJECT DOCUMENTS\n	NaN
1	5.2.1.4 BUSINE DOCUMENTS\n	NaN

Extraction du texte:

('5.1.1.1 PROJECT CHARTER\n\nDescribed in Section 4.1.3.1. The project charter documents the project purpose, highlevel project description,\nassumptions, constraints, and highlevel requirements that the project is intended to satisfy.\n\n5.1.1.2 PRO JECT MANNAGEMENT PLAN\nDescribed in Section 4.2.3.1. Project management plan components include but are not limited to:\n\n Quality management plan. Described in Section 8.1.3.1. The way the project and product scope will beanaged can be influenced by how the organization's quality policy, methodologies, and standards are\nimplemented on the project.\n\n Project life cycle description. The project life cycle determines the series of phases that a project passes\nthrough from its inception to the e nd of the project.\n\n Development approach. The development approach defines whether waterfall, iterative, adaptive, agile, or a\nhybrid development approach will be used.\n\n5.1.1.3 ENTERPRISE ENVIRONMENTAL FACTORS\n\nThe enterprise environmental f actors that can influence the Plan Scope Management process include but are not\nlimited to:\n\n Organization's culture,\n In frastructure,\n Personnel administration, and\n\n Marketplace conditions.\n\n135\n5.1.1.4 ORGANIZATIONAL PROCE ARTS\n\nThe or ganizational process assets that can influence the Plan Scope Management process include but are not\nlimited to:\n\n Prolicies and procedures, and\n\n Historical information and lessons learned repositories.\n\n5.1.2 PLAN SCOPE MANAGEMENT: TOOLS AND TECHNIQUES\n\n5.1.2.1 EXPERT JUDGMENT\n\nbescribed in Section 4.1.2.1 Expertise should be considered from individuals or groups with specialized knowledger training in the following topics:\n\n Previous similar projects, and\n\n Information in the in dustry, discipline, and application area.\n\n5.1.2.2 DATA ANALYSIS\n\nA data analysis technique that can be used for this process includes but is not limited to alternatives analysis.\nVarious ways of collecting requirements, elaborating the project and product scope, creating the produ

<u>Transformation le texte en data frame :</u>

```
Entrée [21]: import pandas as pd
                dict = {'Content' : one}
                df19999
                          pd.DataFrame(dict)
                df10000
    Out[21]:
                      .1 PROJECT CHARTER Described in Section 4.1.3...
                          EXPERT JUDGMENT Described in Section 4.1.2.
                 2
                         DATA ANALYSIS A data analysis technique tha...
                  3
                            MEETINGS Project teams may attend project m...
                 4 SCOPE MANAGEMENT PLAN The scope management ...
                 86
                          . The scope management plan may be updated to ...
                 87
                 88 PROJECT DOCUMENTS UPDATES Project documents ...
                 89
                           . Requirements documentation may be updated w...
                 90
                              . The requirements traceability matrix may be...
                91 rows × 1 columns
```

Extraction des références de chaque ligne de la colonne 'Content' :

```
Entrée [23]: df10000['REF']=df10000['Content'].str.findall(r'Described in Section \d.\d.\d.\d+')
df10000['REF']=df10000['REF']+df10000['Content'].str.findall(r'depicted in Figure \df10000['REF']=df10000['REF']+df10000['Content'].str.findall(r'Figure \d\d+')
      Out[23]:
                                                                               Content
                                                                                                                                        REF
                      0
                             .1 PROJECT CHARTER Described in Section 4.1.3... [Described in Section 4.1.3.1, Described in Se...
                                  EXPERT JUDGMENT Described in Section 4.1.2....
                                                                                                             [Described in Section 4.1.2.1]
                      2
                                   DATA ANALYSIS A data analysis technique tha...
                                   MEETINGS Project teams may attend project m.
                      4 SCOPE MANAGEMENT PLAN The scope management ...
                     86
                                 . The scope management plan may be updated to ...
                                                                                                                                            П
                      87
                                      . Changes to the scope baseline are incorpora... [Described in Section 6.5.3.1, Described in Se.
                      88 PROJECT DOCUMENTS UPDATES Project documents ...
                                   Requirements documentation may be updated w...
                      90
                                      . The requirements traceability matrix may be...
                    91 rows × 2 columns
```

Appliquer les méthodes de pre-processing de NLP :

- Lowercase.
- Remove text in square brackets.
- Remove links.
- Remove punctuations.
- Remove words containing numbers.

```
Entrée [24]: def clean_text(text):

''Make text lowercase, remove text in square brackets, remove links, remove punctuation
                        "Make text Invercase, remove text in square bra
and remove words containing numbers.""
text = str(text).lower()
text = re.sub('\[.*?\]', '', text)
text = re.sub('\[.*?\]', '', text)
text = re.sub('\[.*]\]', '', text)
return text
                        return text
Entrée [25]: df10000['Content_clean'] = df10000['Content'].apply(lambda x : clean_text(x))
df10000
     Out[25]:
                                                                         Content
                                                                                                                                                                        Content clean
                    0 .1 PROJECT CHARTER Described in Section 4.1.3... [Described in Section 4.1.3.1, Described in Se... project charter described in section t...
                              EXPERT JUDGMENT Described in Section 4.1.2....
                                                                                                  [Described in Section 4.1.2.1]
                                                                                                                                               expert judgment described in section ex...
                   2 DATA ANALYSIS A data analysis technique tha...
                                                                                                    [] data analysis a data analysis technique tha...
                     3
                               MEETINGS Project teams may attend project m...
                                                                                                                                        meetings project teams may attend project m...
                    4 SCOPE MANAGEMENT PLAN The scope management ...
                                                                                                                        [] scope management plan the scope management ...
                   86 . The scope management plan may be updated to...
                                                                                                             [] the scope management plan may be updated to...
                    87
                                   . Changes to the scope baseline are incorpora... [Described in Section 6.5.3.1, Described in Se...
                                                                                                                                          changes to the scope baseline are incorpora...
                   88 PROJECT DOCUMENTS UPDATES Project documents ... [Described in Section 4.4.3.1] project documents updates project documents ...
                               . Requirements documentation may be updated w...
                                                                                                                                  [] requirements documentation may be updated w...
                    90
                                . The requirements traceability matrix may be...
                                                                                                                          [] the requirements traceability matrix may be...
                   91 rows × 3 columns
```

Extraction des définitions de chaque ligne de la colonne 'Content' :

						df1
Definiti	Content_clean	REF	Content	TYPE	Concept	
.1 PROJECT CHART	project charter described in section t	[Described in Section 4.1.3.1, Described in Se	.1 PROJECT CHARTER Described in Section 4.1.3	NaN	5.1 PLAN SCOPE MANAGEMENT\n	0
EXPERT JUDGME	expert judgment described in section ex	[Described in Section 4.1.2.1]	EXPERT JUDGMENT Described in Section 4.1.2	INPUTS	5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n	1
DATA ANALYSIS A data analy technique th	data analysis a data analysis technique tha	0	DATA ANALYSIS A data analysis technique tha	NaN	5.1.1.1 PROJECT CHARTER\n	2
MEETINGS Project teams n attend project r	meetings project teams may attend project m	0	MEETINGS Project teams may attend project m	NaN	5.1.1.2 PROJECT MANAGEMENT PLAN\n	3
SCOPE MANAGEMENT PL The scope managemen	scope management plan the scope management	0	SCOPE MANAGEMENT PLAN The scope management	NaN	5.1.1.3 ENTERPRISE ENVIRONMENTAL FACTORS\n	4

PROJECT MANAGEME PLAN UPDATES Any change	project management plan updates any change	0	PROJECT MANAGEMENT PLAN UPDATES Any change	OUTPUTS	5.6.3 CONTROL SCOPE: OUTPUTS\n	85
. The scope management p may be updated t	the scope management plan may be updated to	0	. The scope management plan may be updated to	NaN	5.6.3.1 WORK PERFORMANCE INFORMATION\n	86
. Changes to the scope basel are incorpor	changes to the scope baseline are incorpora	[Described in Section 6.5.3.1, Described in Se	. Changes to the scope baseline are incorpora	NaN	5.6.3.2 CHANGE REQUESTS\n	87
PROJECT DOCUMEN UPDATES Project documents	project documents updates project documents	[Described in Section 4.4.3.1]	PROJECT DOCUMENTS UPDATES Project documents	NaN	5.6.3.3 PROJECT MANAGEMENT PLAN UPDATES\n	88
. Requirements documentat may be updated	requirements documentation may be updated w	0	. Requirements documentation may be updated w	NaN	5.6.3.4 PROJECT DOCUMENTS UPDATES\n	89

Segmentation des données

trée [35]:	df1[nltk.tokenize import 'new'] = df1['Content_ head(40)	_					
Out[35]:		Concept	TYPE	Content	REF	Content_clean	Definition	new
	0	5.1 PLAN SCOPE MANAGEMENT\n	NaN	.1 PROJECT CHARTER Described in Section 4.1.3	[Described in Section 4.1.3.1, Described in Se	project charter described in section t	.1 PROJECT CHARTER	[project, charter described, in, section the
	1	5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n	INPUTS	EXPERT JUDGMENT Described in Section 4.1.2	[Described in Section 4.1.2.1]	expert judgment described in section ex	EXPERT JUDGMENT	[expert, judgment described, in, section exp
	2	5.1.1.1 PROJECT CHARTER\n	NaN	DATA ANALYSIS A data analysis technique tha	О	data analysis a data analysis technique tha	DATA ANALYSIS A data analysis technique tha	[data, analysis, a data, analysis technique,
	3	5.1.1.2 PROJECT MANAGEMENT PLANIn	NaN	MEETINGS Project teams may attend project m	П	meetings project teams may attend project m	MEETINGS Project teams may attend project m	[meetings, project teams, may, attend projec
	4	5.1.1.3 ENTERPRISE ENVIRONMENTAL FACTORS\n	NaN	SCOPE MANAGEMENT PLAN The scope management	П	scope management plan the scope management	SCOPE MANAGEMENT PLAN The scope management	[scope, management plan, the, scope manageme
				DECHIDEMENTS	[depicted in	requirements	DECHIDEMENTS	fraguiraments

Stop-Words

```
Entrée [37]: import nltk nltk.download("stopwords")
                         from nltk.corpus import stopwords
                          stop = set(stopwords.words('english')) \\ df1['new'] = df1['new'].apply(lambda x: [word for word in x if word not in stop]) \\
                         df1
                          [nltk_data] Downloading package stopwords to
                                                   C:\Users\MSI\AppData\Roaming\nltk_data...
Package stopwords is already up-to-date!
                          [nltk data]
                         [nltk_data]
       Out[37]:
                                                                                                                                                                             Content_clean
                                                                                                                                                        REF
                                                                                                                                                                                                                           Definition
                                                                                                .1 PROJECT CHARTER
Described in Section
4.1.3...
                                                                                                                                      [Described in Section 4.1.3.1, Described in Se... project charter described in section t...
                                                                                                                                                                                                                                                      [project, charter,
described, section,
project...
                                                                                                                                                                                                          .1 PROJECT CHARTER
                                                                                                  EXPERT JUDGMENT
Described in Section
4.1.2....
                                                                                                                                                                                                                                                      [expert, judgment,
described, section,
experti...
                                 5.1.1 PLAN SCOPE
MANAGEMENT: INPUTS\n
                                                                                                                                         [Described in
Section 4.1.2.1]
                                                                                                                                                                expert judgment described in section ex...
                                                                             INPUTS
                                                                                                                                                                                                            EXPERT JUDGMENT
                                               5.1.1.1 PROJECT
CHARTER\n
                                                                                                DATA ANALYSIS A data
                                                                                                                                                            data analysis a data analysis technique tha...
                                                                                                                                                                                                          DATA ANALYSIS A data analysis technique tha... [data, analysis, data, analysis, technique, us...
                            2
                                                                                  NaN
                                                                                                                                                                                                                                                      [meetings, project,
                                                                                             MEETINGS Project teams 
may attend project m...
                                                                                                                                                                   meetings project teams 
may attend project m...
                                                                                                                                                                                                      MEETINGS Project teams 
may attend project m...
                                      5.1.1.2 PROJECT
MANAGEMENT PLAN\n
                                                                                                                                                                                                                                                    teams, may, attend,
projec...
                            3
                                                                                  NaN
                                          5.1.1.3 ENTERPRISE
                                                                                               SCOPE MANAGEMENT
                                                                                                                                                                                                         SCOPE MANAGEMENT
                                                                                                                                                                 scope management plan 
the scope management
                                                                                                                                                                                                                                                 Iscope, management,
                            4
                                                                                                                                                                                                                                                      plan, scope,
management, p...
                                              ENVIRONMENTAL
FACTORS\n
                                                                                  NaN
                                                                                                         PLAN The scope
                                                                                                                                                                                                                   PLAN The scope
                                                                                                           management ...
                                                                                                                                                                                                                     management ...
                                                                                            PROJECT MANAGEMENT
PLAN UPDATES Any
                                                                                                                                                                       project management plan updates any PROJECT MANAGEMENT PLAN UPDATES Any
                                                                                                                                                                                                                                                [project, management, plan, updates, change,
                                     5.6.3 CONTROL SCOPE: OUTPUTS
                                                                                                                  change .
                                                                                                                                                                                   change ..
                                                5.6.3.1 WORK
PERFORMANCE
INFORMATION\n
                                                                                                                                                                   the scope management plan may be updated
                                                                                                                                                                                                                                                 [scope, management,
plan, may, updated,
reflec...
                                                                                              . The scope management plan may be updated to...
                                                                                                                                                                                                        . The scope management plan may be updated to...
                                                                                                                                                            []
                                                                                                                                                                                                                                                [changes, scope,
baseline, incorporated,
respo...
                                                5.6.3.2 CHANGE
REQUESTS\n
                                                                                               . Changes to the scope baseline are incorpora...
                                                                                                                                                                  changes to the scope baseline are incorpora...
                                                                                                                                                                                                         . Changes to the scope baseline are incorpora...
                           87
                                                                                  NaN
                                         5.6.3.3 PROJECT
MANAGEMENT PLAN
                                                                                                                                                                          project documents
                                                                                                                                                                                                       PROJECT DOCUMENTS
UPDATES Project
documents ...
                                                                                                                                                                                                                                                   [project, documents,
updates, project,
documen...
                                                                                              PROJECT DOCUMENTS
                                                                                                                                         [Described in Section 4.4.3.1]
                                                                                  NaN
                                                      UPDATES\n
                                                                                                                                                                   requirements documentation may be
                                                                                                                                                                                                                                                  [requirements,
documentation, may,
updated, ad...
                                                                                                             Requirements
                                                                                                                                                                                                                      . Requirements
                                 5.6.3.4 PROJECT DOCUMENTS UPDATES\n
                                                                                                 documentation may be 
updated w...
                                                                                                                                                                                                           documentation may be 
updated w...
                                                                                  NaN
```

• Bigrame+Trigramme+post tagging

	<pre>trée [43]: df1['new1'] = df1['new'].apply(lambda x: pos_tag_wordnet(x)) df1.head()</pre>								
Out[43]:	Out[43]: Concept TYPE		Content	REF	Content_clean	Definition	new	new1	
	0	5.1 PLAN SCOPE MANAGEMENT\n	NaN	.1 PROJECT CHARTER Described in Section 4.1.3	[Described in Section 4.1.3.1, Described in Se	project charter described in section t	.1 PROJECT CHARTER	[project, charter, described, section, project	[(project, n), (charter, n), (described, v), (
	1	5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n	INPUTS	EXPERT JUDGMENT Described in Section 4.1.2	[Described in Section 4.1.2.1]	expert judgment described in section ex	EXPERT JUDGMENT	[expert, judgment, described, section, experti	[(expert, n), (judgment, n), (described, v), (
	2	5.1.1.1 PROJECT CHARTER\n	NaN	DATA ANALYSIS A data analysis technique tha	О	data analysis a data analysis technique tha	DATA ANALYSIS A data analysis technique tha	[data, analysis, data, analysis, technique, us	[(data, n), (analysis, n), (data, n), (analysi
	3	5.1.1.2 PROJECT MANAGEMENT PLAN\n	NaN	MEETINGS Project teams may attend project m	П	meetings project teams may attend project m	MEETINGS Project teams may attend project m	[meetings, project, teams, may, attend, projec	[(meetings, n), (project, n), (teams, n), (may
	4	5.1.1.3 ENTERPRISE ENVIRONMENTAL FACTORS\n	NaN	SCOPE MANAGEMENT PLAN The scope management	0	scope management plan the scope management	SCOPE MANAGEMENT PLAN The scope management	[scope, management, plan, scope, management, p	[(scope, n), (management, n), (plan, n), (scop

Synonym

	Concept	TYPE	Content	REF	Content_clean	Definition	new	new1	new2	synonym
0	5.1 PLAN SCOPE MANAGEMENT\n	NaN	.1 PROJECT CHARTER Described in Section 4.1.3	[Described in Section 4.1.3.1, Described in Se	project charter described in section t	.1 PROJECT CHARTER	[project, charter, described, section, project	[(project, n), (charter, n), (described, v), ([(project, n), (charter, n), (described, v), ({factor, plan, status, intended, standard, sen
1	5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n	INPUTS	EXPERT JUDGMENT Described in Section 4.1.2	[Described in Section 4.1.2.1]	expert judgment described in section ex	EXPERT JUDGMENT	[expert, judgment, described, section, experti	[(expert, n), (judgment, n), (described, v), ([(expert, n), (judgment, n), (described, v), ({cost, specialised, report, distinguish, plan,
2	5.1.1.1 PROJECT CHARTER\n	NaN	DATA ANALYSIS A data analysis technique tha	0	data analysis a data analysis technique tha	DATA ANALYSIS A data analysis technique tha	[data, analysis, data, analysis, technique, us	[(data, n), (analysis, n), (data, n), (analysi	[(data, n), (analysis, n), (data, n), (analysi	{plan, send_away, pile_up, flesh_out, tooshie,
3	5.1.1.2 PROJECT MANAGEMENT PLAN\n	NaN	MEETINGS Project teams may attend project m	0	meetings project teams may attend project m	MEETINGS Project teams may attend project m	[meetings, project, teams, may, attend, projec	[(meetings, n), (project, n), (teams, n), (may	[(meetings, n), (project, n), (teams, n), (may	{whitethorn, plan, arise, extremity, required,
4	5.1.1.3 ENTERPRISE ENVIRONMENTAL FACTORS\n	NaN	SCOPE MANAGEMENT PLAN The scope management	0	scope management plan the scope management	SCOPE MANAGEMENT PLAN The scope management	[scope, management, plan, scope, management, p	[(scope, n), (management, n), (plan, n), (scop	[(scope, n), (management, n), (plan, n), (scop	{factor, acceptation, plan, validated, send_aw
85	5.6.3 CONTROL SCOPE: OUTPUTS\n	OUTPUTS	PROJECT MANAGEMENT PLAN UPDATES Any change	0	project management plan updates any change	PROJECT MANAGEMENT PLAN UPDATES Any change	[project, management, plan, updates, change, p	[(project, n), (management, n), (plan, n), (up	[(project, n), (management, n), (plan, n), (up	{factor, plan, disco_biscuit, break_down, cogn
86	5.6.3.1 WORK PERFORMANCE INFORMATION\n	NaN	. The scope management plan may be updated to	0	the scope management plan may be updated to	. The scope management plan may be updated to	[scope, management, plan, may, updated, reflec	[(scope, n), (management, n), (plan, n), (may,	[(scope, n), (management, n), (plan, n), (may,	{whitethorn, cost, report, distinguish, plan,
87	5.6.3.2 CHANGE REQUESTS\n	NaN	. Changes to the scope baseline are incorpora	[Described in Section 6.5.3.1, Described in Se	changes to the scope baseline are incorpora	. Changes to the scope baseline are incorpora	[changes, scope, baseline, incorporated, respo	[(changes, n), (scope, n), (baseline, n), (inc	[(changes, n), (scope, n), (baseline, n), (inc	{send_away, soh, couch, tooshie, group_A, Wb,

Similarity

```
Similarity: 0.18570521473884583
                                   project
Similarity: 0.05067988112568855
                                   expert
Similarity: 0.18677888810634613
                                   data
Similarity: 0.09646563231945038
                                   meetings
Similarity: 0.07418753206729889
                                   scope
Similarity: 0.12520818412303925
                                   requirements
Similarity: 0.18570521473884583
                                   project
Similarity: 0.15778063237667084
                                   project
Similarity: 0.010815915651619434
                                    the
Similarity: 0.005686407908797264
                                     the
Similarity: 0.11796143651008606
                                   project
Similarity: 0.07132532447576523
                                   busine
Similarity: 0.14040763676166534
                                   agreements
Similarity: 0.03733307868242264
                                   enterprise
Similarity: -0.09046298265457153
                                   organizational
Similarity: 0.05067988112568855
                                   expert
Similarity: 0.16039255261421204
                                   data
Similarity: 0.1788518875837326
                                  data
Similarity: 0.04805265739560127
                                   decision
Similarity: 0.17617206275463104
                                   data
Similarity: 0.01544579304754734
                                   interpersonal
Similarity: 0.11939940601587296
                                   context
Similarity: 0.018785659223794937
                                  prototypes
Similarity: 0.08332089334726334
                                   requirements
Similarity: 0.11349549889564514
                                   requirements
Similarity: 0.18570521473884583
                                   project
Similarity: 0.14565090835094452
                                   project
Similarity: 0.1082460805773735
                                   which
Similarity: 0.11796143651008606
                                   project
                                   requirements
Similarity: 0.09617016464471817
Similarity: 0.03733307868242264
                                   enterprise
Similarity: -0.09046298265457153
                                   organizational
Similarity: 0.05067988112568855
                                   expert
Similarity: 0.1889413595199585
                                  data
Similarity: 0.01093687117099762
                                   decision
Similarity: 0.04958058521151543
                                    а
Similarity: 0.01544579304754734
                                   interpersonal
Similarity: 0.1281757950782776
                                  product
Similarity: 0.18083687126636505
                                   project
Similarity: 0.12821926176548004
                                   project
Similarity: 0.14967992901802063
                                    requirements
Similarity: -0.010793756693601608
                                     the
Similarity: 0.1415296196937561
                                 project
Similarity: 0.006941767875105143
                                    the
Similarity: 0.10296080261468887
                                   project
```

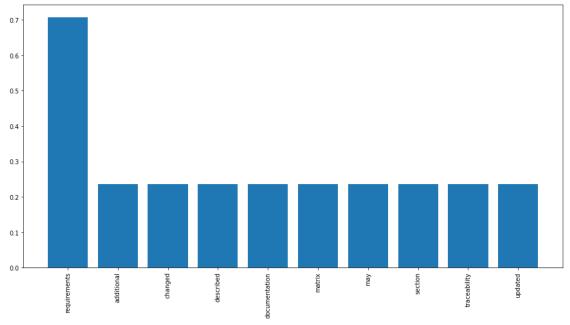
Extraire les mots clés de chaque contenu en utilisant le 'TF-IDF'

```
from sklearn.feature_extraction.text import CountVectorizer from sklearn.feature_extraction.text import TfidfTransformer from sklearn.feature_extraction.text import TfidfVectorizer
from nltk.corpus import stopwords
stop = stopwords.words('english')
df1['keywords'] = df1['Content_clean'].apply(lambda x: ' '.join([word for word in x.split() if word not in (stop)]))
#using the count vectorizer
for i in range(1,len(df1['keywords'])):
     count = CountVectorizer()
     word_count=count.fit_transform([df1['keywords'][i]])
     tfidf\_transformer=TfidfTransformer(smooth\_idf=True,use\_idf=True)
     tfidf_transformer.fit(word_count)
     #inverse document frequency
     df_idf.sort_values(by=['idf_weights'])
     #tfidf
     tf_idf_vector=tfidf_transformer.transform(word_count)
     feature_names = count.get_feature_names_out()
     first\_document\_vector=tf\_idf\_vector[0]\\ df\_tfifd=\ pd.DataFrame(first\_document\_vector.T.todense(),\ index=feature\_names,\ columns=["tfidf"])
      \begin{array}{lll} tf\_idf = df\_tfifd.sort\_values(by=["tfidf"],ascending=False) \\ tf\_idf = tf\_idf[tf\_idf["tfidf"] != 0.0] \\ df1['keywords'][i] = tf\_idf.index.tolist() \\ \end{array}
```

Concept	TYPE	Content	REF	Content_clean	Definition	new	new1	new2	synonym	keywords
5.1 PLAN SCOPE MANAGEMENT\n	NaN	.1 PROJECT CHARTER Described in Section 4.1.3	[Described in Section 4.1.3.1, Described in Se	project charter described in section t	.1 PROJECT CHARTER	[project, charter, described, section, project	[(project, n), (charter, n), (described, v), ([(project, n), (charter, n), (described, v), ({factor, plan, status, intended, standard, sen	project charter described section project char
5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n	INPUTS	EXPERT JUDGMENT Described in Section 4.1.2	[Described in Section 4.1.2.1]	expert judgment described in section ex	EXPERT JUDGMENT	[expert, judgment, described, section, experti	[(expert, n), (judgment, n), (described, v), ([(expert, n), (judgment, n), (described, v), ({cost, specialised, report, distinguish, plan,	[application, information, topics, specialized
5.1.1.1 PROJECT CHARTER\n	NaN	DATA ANALYSIS A data analysis technique tha	0	data analysis a data analysis technique tha	DATA ANALYSIS A data analysis technique tha	[data, analysis, data, analysis, technique, us	[(data, n), (analysis, n), (data, n), (analysi	[(data, n), (analysis, n), (data, n), (analysi	{plan, send_away, pile_up, flesh_out, tooshie,	[scope, analysis, product, data, alternatives,
5.1.1.2 PROJECT MANAGEMENT PLAN\n	NaN	MEETINGS Project teams may attend project m	0	meetings project teams may attend project m	MEETINGS Project teams may attend project m	[meetings, project, teams, may, attend, projec	[(meetings, n), (project, n), (teams, n), (may	[(meetings, n), (project, n), (teams, n), (may	{whitethorn, plan, arise, extremity, required,	[project, management, scope, plan, selected, m
5.1.1.3 ENTERPRISE :NVIRONMENTAL FACTORS\n	NaN	SCOPE MANAGEMENT PLAN The scope management	0	scope management plan the scope management 	SCOPE MANAGEMENT PLAN The scope management	[scope, management, plan, scope, management, p	[(scope, n), (management, n), (plan, n), (scop	[(scope, n), (management, n), (plan, n), (scop	{factor, acceptation, plan, validated, send_aw	[scope, plan, project, management, process, fo
5.6.3 CONTROL SCOPE: OUTPUTS\n	OUTPUTS	PROJECT MANAGEMENT PLAN UPDATES Any change	0	project management plan updates any change	PROJECT MANAGEMENT PLAN UPDATES Any change	[project, management, plan, updates, change, p	[(project, n), (management, n), (plan, n), (up	[(project, n), (management, n), (plan, n), (up	{factor, plan, disco_biscuit, break_down, cogn	[change, plan, management, project, request, u
5.6.3.1 WORK PERFORMANCE INFORMATION\n	NaN	. The scope management plan may be updated to	0	the scope management plan may be updated to	. The scope management plan may be updated to	[scope, management, plan, may, updated, reflec	[(scope, n), (management, n), (plan, n), (may,	[(scope, n), (management, n), (plan, n), (may,	{whitethorn, cost, report, distinguish, plan,	[scope, baseline, change, described, managed,
5 6 3 2 CHANGE		. Changes to the scope	[Described in Section	changes to the	. Changes to the scope	[changes, scope,	[(changes, n), (scope n)	[(changes, n), (scope n)	{send_away, soh, couch,	[baseline, performance,

Visualisation des mots clés à partir d'un graphe :

```
import matplotlib.pyplot as plt
plt.figure(figsize=(16,8))
plt.bar(tf_idf.index,tf_idf["tfidf"])
plt.xticks(rotation=90)
plt.show()
```



Chunkig

```
Entrée [56]:

def conll_tag_chunks(chunk_sents):
    tagged_sents = [tree2conlltags(tree) for tree in chunk_sents]
    return [[(t, c) for (w, t, c) in sent] for sent in tagged_sents]

def combined_tagger(train_data, taggers, backoff=None):
    for tagger in taggers:
        backoff = tagger(train_data, backoff=backoff)
    return backoff

#Define the chunker class

class NGramTagChunker(ChunkParserI):
    def __init__(self,train_sentences,tagger_classes=[UnigramTagger,BigramTagger]):
        train_sent_tags=conll_tag_chunks(train_sentences)
        self.chunk_tagger=combined_tagger(train_sent_tags,tagger_classes)

def parse(self,tagged_sentence):
    if not tagged_sentence:
        return None
    pos_tags=[tag for word, tag in tagged_sentence]
        chunk_pos_tags=self.chunk_tagger.tag(pos_tags)
        chunk_pos_tags=self.chunk_tagger.tag(pos_tags)
        chunk_tags=[chunk_tag for (pos_tag,chunk_tag) in chunk_pos_tags]
        wpc_tags=[(wnc, pos_tag,chunk_tag) for ((word, pos_tag),chunk_tag) in zip(tagged_sentence,chunk_tags)]
    return conlltags2tree(wpc_tags)
```

```
Entrée [74]: nltk_pos_tagged = nltk.pos_tag(text.split())
chunk_tree = ntc.parse(nltk_pos_tagged)
Entrée [75]: print(chunk_tree)
                 (S $\rm (NP\ scope/NN\ management/NN\ plan/NN\ Scope/NNP\ management/NN\ plan/NN)}
                    (VP be/VB)
(NP component/JJ project/NN management/NN plan/NN)
                    (VP describe/VBZ)
                    (VP will/MD be/VB)
(NP define/JJ)
                    (VP develop/VB)
                    (NP monitor/NN)
                    (NP control/NN)
                    (NP validate/NN)
                    (NP component/NN Scope/NNP management/NN plan/NN)
                    (VP include/VBP)
                      Process/NNP
                      prepare/NN
project/NN
                      Scope/NNP
                      statement/NN
                      Process/NNP
enable/JJ
                      creation/NN
WBS/NNP)
                    (VP detailed/VBD)
(NP project/NN Scope/NNP statement/NN Process/NNP)
                    (VP establish/VB)
(NP Scope/NNP baseline/NN)
                    (VP will/MD be/VB)
```

Transformer les résultats en Data Frame :

```
Entrée [80]: import pandas as pd
             df_relation_2_3_4 = pd.DataFrame(list(zip(NP1,VB,NP2)),columns=['noun1','VB','noun2'])
df_relation_2_3_4
   Out[80]:
                                                                   component project management plan
              0 scope management plan Scope management plan
                                                              be
                          component project management plan
                                                          describe
                           Scope will be
              2
                                                define develop
                                                                                                 monitor
              4 component Scope management plan include Process prepare project Scope statement Proces...
              5 Process prepare project Scope statement Proces... detailed
                                                                            project Scope statement Process
              6 project Scope statement Process establish
                                         Scope baseline
                                                         will be maintain Process specify formal acceptance com..
              8 maintain Process specify formal acceptance com... will be obtain Scope management plan
                                   Scope management plan
                                                                                            formal informal
                                                           can be
```



Importation des données et la configuration :

	Concept	TYPE	Definition	REF	Chapitre
0	5.1 PLAN SCOPE MANAGEMENT\n	NaN	.1 PROJECT CHARTER	[Described in Section 4.1.3.1, Described in Se	5.1 PLAN SCOPE MANAGEMENT
1	5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n	INPUTS	EXPERT JUDGMENT	[Described in Section 4.1.2.1]	5.1 PLAN SCOPE MANAGEMENT
2	5.1.1.1 PROJECT CHARTER\n	NaN	DATA ANALYSIS A data analysis technique tha	0	5.1 PLAN SCOPE MANAGEMENT
3	5.1.1.2 PROJECT MANAGEMENT PLAN\n	NaN	MEETINGS Project teams may attend project $\ensuremath{\text{m}}$	0	5.1 PLAN SCOPE MANAGEMENT
4	5.1.1.3 ENTERPRISE ENVIRONMENTAL FACTORS\n	NaN	SCOPE MANAGEMENT PLAN The scope management	0	5.1 PLAN SCOPE MANAGEMENT
85	5.6.3 CONTROL SCOPE: OUTPUTS\n	OUTPUTS	PROJECT MANAGEMENT PLAN UPDATES Any change	0	5.6 CONTROL SCOPE
86	5.6.3.1 WORK PERFORMANCE INFORMATION\n	NaN	. The scope management plan may be updated to	0	5.6 CONTROL SCOPE
87	5.6.3.2 CHANGE REQUESTS\n	NaN	. Changes to the scope baseline are incorpora	[Described in Section 6.5.3.1, Described in Se	5.6 CONTROL SCOPE
88	5.6.3.3 PROJECT MANAGEMENT PLAN UPDATES\n	NaN	PROJECT DOCUMENTS UPDATES Project documents	[Described in Section 4.4.3.1]	5.6 CONTROL SCOPE
89	5.6.3.4 PROJECT DOCUMENTS UPDATES\n	NaN	. Requirements documentation may be updated w	0	5.6 CONTROL SCOPE

Associer à chaque contenu sa référence à travers le paramètre 'DESCRIBED IN'

```
Entrée [93]: df_section = final_df_scope[['Concept','REF']]
    df_section['Data_Property'] = 'Described in'
    df_section = df_section.dropna().reset_index(drop=True)
    df_section = df_section[df_section['REF'].map(lambda x : 0 < len(x))]</pre>
                  df_section = df_section.reset_index(drop=True)
df_section
                  C:\Users\MSI\AppData\Local\Temp/ipykernel_22024/2813421293.py:2: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
                  See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-
                     df_section['Data_Property'] = 'Described in'
     Out[93]:
                                                                                                                               REF Data Property
                                                                           Concept
                                               5.1 PLAN SCOPE MANAGEMENT\n [Described in Section 4.1.3.1, Described in Se... Described in
                                      5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n
                                                                                                      [Described in Section 4.1.2.1] Described in
                   2
                                      5.1.1.4 ORGANIZATIONAL PROCE AETS\n [depicted in Figure 54, Figure 54, Figure 55, ... Described in
                    3 5.1.2 PLAN SCOPE MANAGEMENT: TOOLS AND TECHNIQ...
                                                                                                      [Described in Section 4.1.3.1] Described in
                                                   5.1.2.1 EXPERT JUDGMENT\n
                                                                                                    [Described in Section 4.2.3.1] Described in
                    4
                     5
                                   5.1.3 PLAN SCOPE MANAGEMENT: OUTPUTS\n [Described in Section 4.1.3.2, Described in Se...
                                                                                                                                        Described in
                                   5.2.1.1 PROJECT CHARTER\n [Described in Section 4.1.2.1] Described in
```

Extraction des sujets de chaque chapitres :

```
Entrée [98]: from rdflib.namespace import XSD
                  for i in range(0,len(final_df_scope['Definition'])) :
                       c = URIRef(ns_url+final_df_scope.loc[i, 'Concept'].replace(" ","_"))
desc-final_df_scope.loc[i, 'Definition']
                       #print(desc)
definedby = Literal(desc,datatype=XSD.string)
g.add((c, RDFS.isDefinedBy, definedby))
Entrée [99]: #df_section['Concept'] = df_section['Concept'].apply(lambda x : remove_punct(x))
#df_section['Concept'] = df_section['Concept'].apply(lambda x : remove_number(x))
Entrée [100]: for i in range(1,len(df_section)):
                        1 In range(!,!en(dr_section)):
c = URIRef(ns_url+df_section.loc[i,'Data_Property'].replace(" ","_"))
domaine = URIRef(ns_url+df_section.loc[i,'Concept'].replace(" ","_"))
g.add((c, RDF.type, OWL.DatatypeProperty))
g.add((c, RDFS.domain, domaine))
                         g.add((c, RDFS.range, XSD.string))
Entrée [101]: df_section
   Out[101]:
                                                                          Concept
                                                                                                                             REF Data_Property
                                              5.1 PLAN SCOPE MANAGEMENT\n [Described in Section 4.1.3.1, Described in Se... Described in
                   0
                                     5.1.1 PLAN SCOPE MANAGEMENT: INPUTS\n
                                                                                                     [Described in Section 4.1.2.1] Described in
                  2
                                       5.1.1.4 ORGANIZATIONAL PROCE AETS\n [depicted in Figure 54, Figure 54, Figure 55, ... Described in
                   3 5.1.2 PLAN SCOPE MANAGEMENT: TOOLS AND TECHNIQ...
                                                                                                     [Described in Section 4.1.3.1] Described in
                   4
                                                    5.1.2.1 EXPERT JUDGMENT\n
                                                                                                    [Described in Section 4.2.3.1] Described in
                    5
                                   5.1.3 PLAN SCOPE MANAGEMENT: OUTPUTS\n [Described in Section 4.1.3.2, Described in Se...
                                                                                                                                      Described in
                   6
                                                   5.2.1.1 PROJECT CHARTER\n
                                                                                                    [Described in Section 4.1.2.1] Described in
                                          5.2.1.2 PROJECT MANAGEMENT PLAN\n [Described in Section 4.1.2.2, Described in Se..
                                                                                                    [Described in Section 4.5.2.2] Described in
                   8
                                                5.2.1.3 PROJECT DOCUMENTS\n
                    9
                               5.2.1.6 ENTERPRISE ENVIRONMENTAL FACTORS\n [Described in Section 4.1.2.3, Described in Se...
                                                                                                                                      Described in
                                                                                                           [Figure 56, Figure 56] Described in
                  10
                                       5.2.1.7 ORGANIZATIONAL PROCE AETS\n
                   11
                                                       5.2.2.2 DATA GATHERING\n [depicted in Figure 58, Figure 57, Figure 57, ...
                                                                                                                                      Described in
                   12
                                                      5.2.2.3 DATA ANALYSIS\n [Described in Section 4.1.3.1] Described in
                   13
                                                      5.2.2.4 DECISION MAKING\n
```

Extraction des domaines et des ranges :

Génération du fichier OWL:

```
Entrée [107]: g.serialize(destination='OWL_TEST.owl', format='ntriples')

C:\Users\MSI\anaconda3\lib\site-packages\rdflib\plugins\serializers\nt.py:35: UserWarning: NTSerializer always uses UTF-8 encod ing. Given encoding was: None warnings.warn(

Out[107]: <Graph identifier=N1998166bb50a4eb485f415c56907bc5c (<class 'rdflib.graph.Graph'>)>
```

Construction de l'ontologie :

Evaluation du model:

```
from rouge import Rouge

rouge = Rouge()
score=rouge.get_scores(ch_ont, pmbok, avg=True)

print('Precision = ' +str(score['rouge-1']['r']))
print('f-measure = '+str(score['rouge-1']['f']))

Precision = 0.868421052631579
f-measure = 0.04217252348782983
```

Visualisation du fichier OWL généré à partir du logiciel 'Protégé' :

