```
Install Dependencies
#@title Install Dependencies
%%capture
!pip install transformers==3.1.0
from glob import glob
from tqdm.notebook import tqdm
from google.colab import drive
import os
import seaborn as sns
import numpy as np # linear algebra
import pandas as pd # data processing, CSV file I/O (e.g. pd.read_csv)
from itertools import cycle
cycol = cycle('bgrcmk')
drive.mount('/content/drive')
root path='/content/drive/My Drive/interactions data/aws transcribe test data.pkl'
    Mounted at /content/drive
interactions calls=pd.read pickle(root path)
from transformers import pipeline
classifier = pipeline('zero-shot-classification',
                       model='joeddav/xlm-roberta-large-xnli')
LABELS='labels'
SCORES='scores'
     Downloading: 100%
                                            734/734 [01:48<00:00, 6.78B/s]
     Downloading: 100%
                                            5.07M/5.07M [00:02<00:00, 1.89MB/s]
     Downloading: 100%
                                            150/150 [00:00<00:00, 180B/s]
     Downloading: 100%
                                            25.0/25.0 [01:44<00:00, 4.19s/B]
     Downloading: 100%
                                            2.24G/2.24G [01:40<00:00, 22.3MB/s]
labels=[ "positivo", "negativo", "neutro"]
res=classifier(['no estoy del lado de ningun bando'], labels, multi class=False)
dict(zip(res[LABELS], res[SCORES]))
     {'negativo': 0.005789743270725012,
      'neutro': 0.9753322601318359,
      'positivo': 0.018877986818552017}
```

interactions_calls.loc[:,'transcript']=interactions_calls.transcript.apply(lambda t:]

interactions_calls

₽		user_id		id_contact	date_created	interaction_origin	des_
	0	224784	SAPE880222EP5	NaN	2020-09-21 22:34:39	Agente	Hola te ¡
	1	224784	SAPE880222EP5	NaN	2020-09-21 17:39:43	Cliente	
	2	224784	SAPE880222EP5	NaN	2020-05-18 14:57:58	Agente	
	3	224784	SAPE880222EP5	NaN	2020-05-12 21:04:22	Agente	Hc I
	4	224784	SAPE880222EP5	NaN	2020-05-11 20:36:17	Cliente	te lo r
	456	1151225	MAMC760324DN4	NaN	2020-02-12 18:21:27	Sistema	
	457	273858	MAMC760324DN4	44450569- 1a38-426e- a64a- 2965178f4840	2020-08-04 21:55:22	OUTBOUND	Se int
	458	1035889	SASE701107VBA	NaN	2020-09-02 15:00:34	Sistema	
	459	1213280	SASE701107VBA	NaN	2020-08-31 18:18:59	Agente	Enti- cas
	460	1035889	SASE701107VBA	bbf39fba- d62e-4e88- bbb0- 58b43529e9ac	2020-08-14 21:50:56	INBOUND	Loan oferta

461 rows × 15 columns

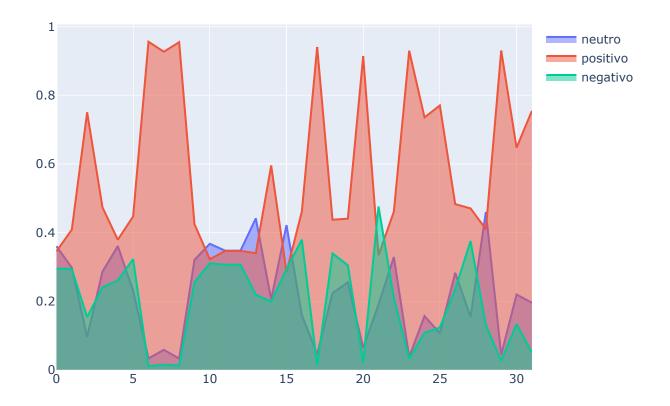
```
def is_nan(x):
    return (x != x)

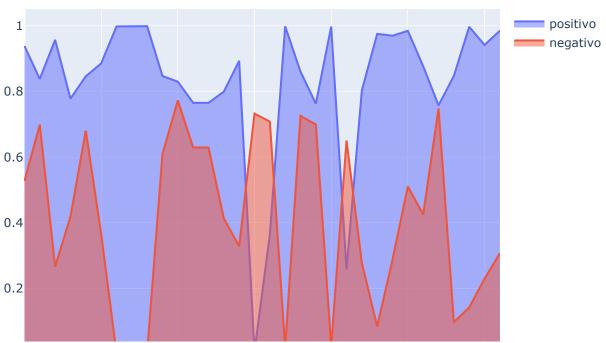
def predict(row,labels=labels,classifier=classifier,multi_class=False):
    sentiments=[]
    if is nan(row):
```

```
#vad n
      return None
    elif len(row)<1:
      return None
    else:
      #prob_speech
      for sentence in row:
        #transcript
        res=classifier(sentence, labels, multi_class=multi_class)
        sentiments.append(dict(zip(res[LABELS], res[SCORES])))
    return {k: [dic[k] for dic in sentiments] for k in sentiments[0]}
from multiprocessing import Pool
from functools import partial
predict_binary=partial(predict,labels=['positivo','negativo'],multi_class=True)
transcripts=interactions_calls['transcript'].values
with Pool(8) as p:
  interactions_calls['sentiment']=[sentiments for sentiments in tqdm(p.imap(predict,t))
with Pool(8) as p:
  interactions_calls['sentiment binary']=[sentiments for sentiments in tqdm(p.imap(pre
C→
     100%
                                          461/461 [35:07<00:00, 4.57s/it]
     100%
                                          461/461 [23:05<00:00, 3.01s/it]
samples=interactions calls[interactions calls.sentiment.notnull()][['transcript','sent
samples
\Box
```

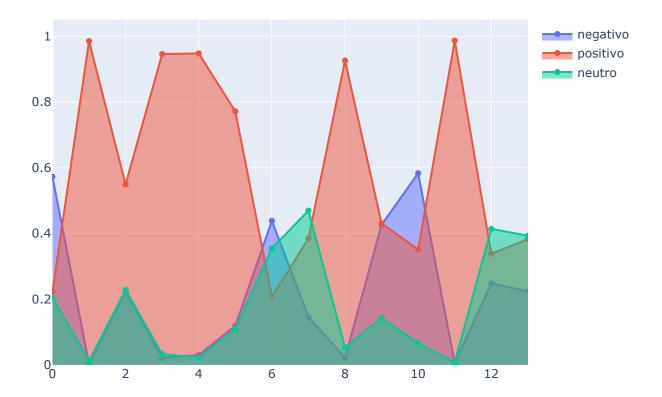
```
transcript
                                                         sentiment
                                                                             sentiment binary
                                                            {'neutro':
                                                                                        {'positivo':
              [Sí buenas tardes, habló a
       42
                                               [0.3602646291255951,
                                                                            [0.9380167126655579,
                   Eugenio, Mira por a...
                                                  0.297514855861...
                                                                                  0.8379161357...
                                                          {'negativo':
                                                                                       {'negativo':
             [la gripa, bueno, disculpe Es
       60
                                               [0.5728645324707031,
                                                                            [0.8840526938438416,
                    que siempre anda...
                                                     0.0027203352...
                                                                                  0.0011707491...
                                                          {'negativo':
                                                                                       {'negativo':
             [la gripa, bueno, disculpe Es
       61
                                               [0.5728645324707031,
                                                                            [0.8840526938438416,
                    que siempre anda...
                                                     0.0027203352...
                                                                                  0.0011707491...
                                                                                        {'positivo':
                                                            {'neutro':
              [Hola que tal Buenos días,
      100
                                               [0.3625732660293579,
                                                                            [0.8919315338134766,
                   Fabiola Barbosa, gr...
                                                  0.359371036291...
                                                                                  0.8835017085...
                                                                                        {'positivo':
                                                           {'positivo':
                  [Hola señorita buenas,
      101
                                                                            [0.9803280830383301,
                                               [0.8379055857658386,
               bretón, Quiero ver cuán...
                                                     0.3165355026...
                                                                                  0.7234244942...
                                                           {'positivo':
                                                                                        {'positivo':
                   [sí que le llama No se
      118
                                             [0.42626598477363586,
                                                                            [0.8024404048919678,
              encuentra por el moment...
                                                      0.411001294...
                                                                                  0.7981640100...
                                                                                        {'positivo':
                    [buenas tardes, con,
                                                            {'neutro':
      158
                Eugenio Sánchez Salas,
                                               [0.3880135416984558,
                                                                            [0.8666232228279114,
import plotly.graph objects as go
def plot lines(sample):
  fig = go.Figure()
  for key in sample.keys():
     fig.add trace(go.Scatter(x=list(range(len(sample[key]))), y=sample[key], fill='to;
  fig.show()
                                                     0.2900031507...
                                                                                  0.7/34022/36...
for sample in samples.to dict('records'):
  print(sample['transcript'])
  plot lines(sample['sentiment'])
  plot lines(sample['sentiment binary'])
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```

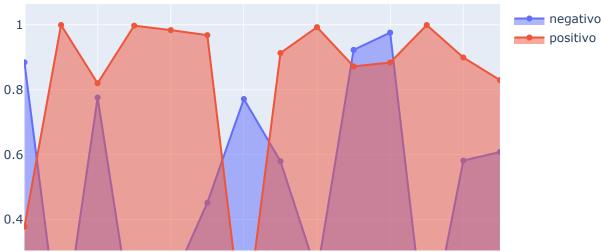
['Sí buenas tardes', 'habló a Eugenio', 'Mira por aquí me interesa estoy interesa

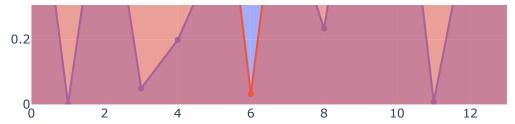




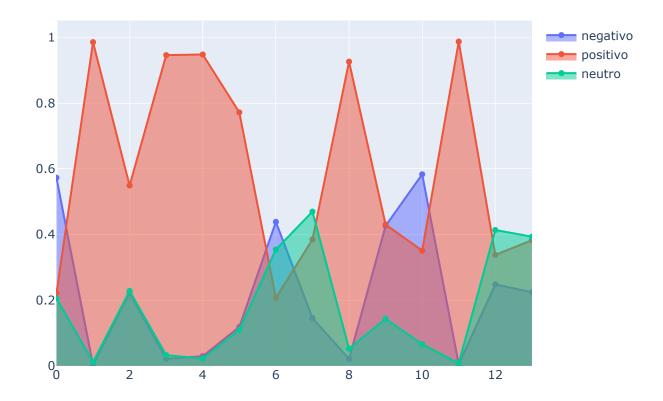
['la gripa', 'bueno', 'disculpe Es que siempre andamos acá', 'Baja California he:



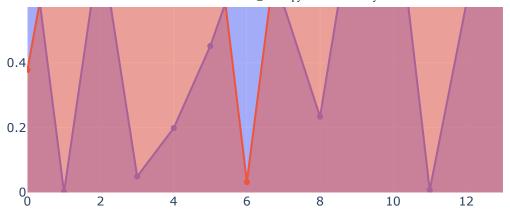




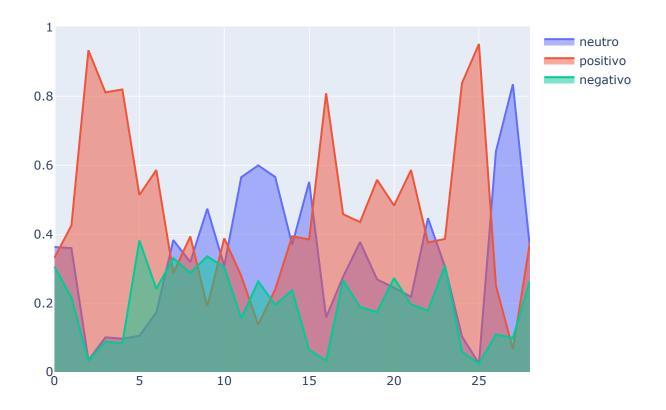
['la gripa', 'bueno', 'disculpe Es que siempre andamos acá', 'Baja California he:



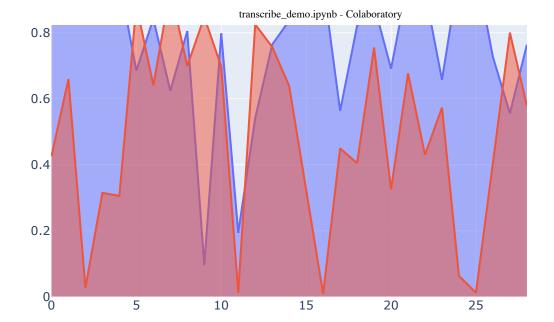




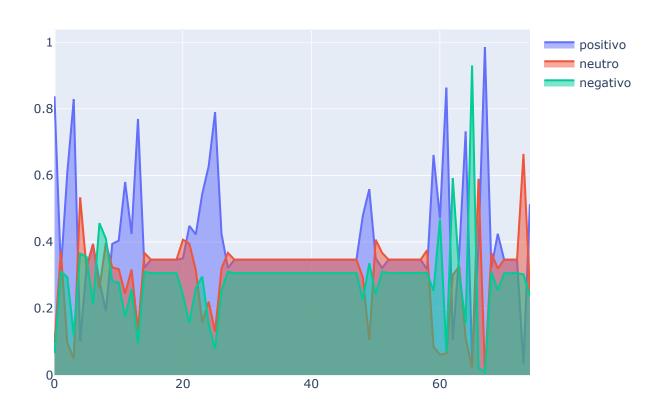
['Hola que tal Buenos días', 'Fabiola Barbosa', 'gracias gracias', 'Sí lo que pa

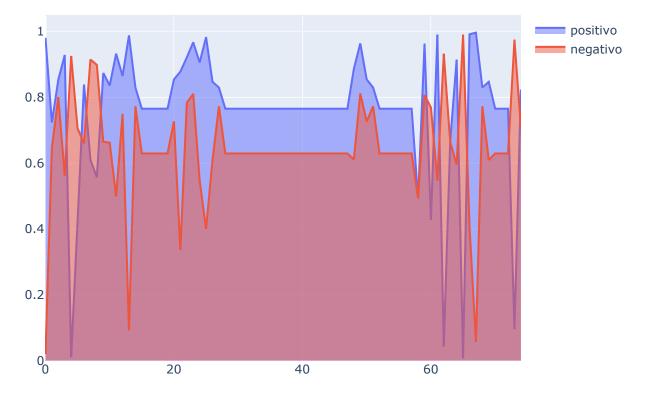




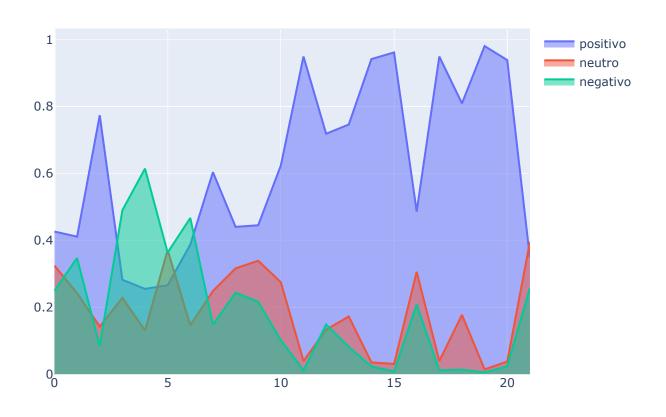


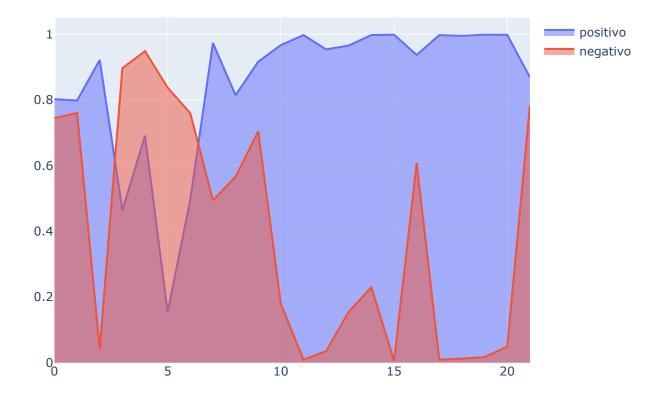
['Hola señorita buenas', 'bretón', 'Quiero ver cuánto es lo que tengo que pagar'



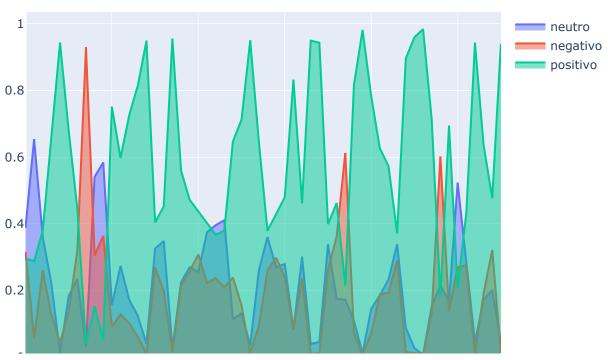


['sí que le llama No se encuentra por el momento', 'De qué empresa', 'Sí porque (

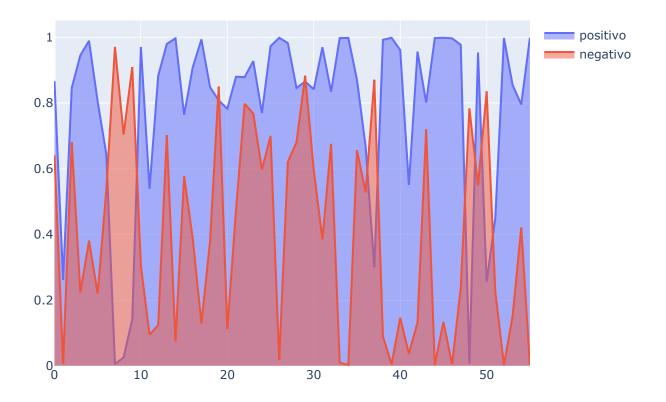




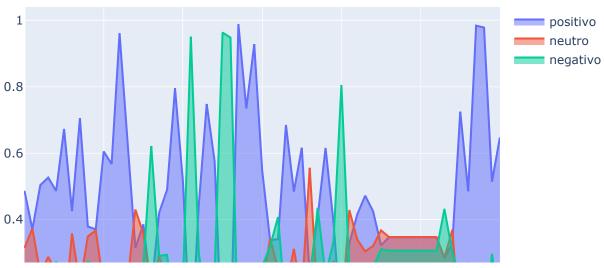
['buenas tardes', 'con', 'Eugenio Sánchez Salas', 'por ahí éste habíamos hecho',

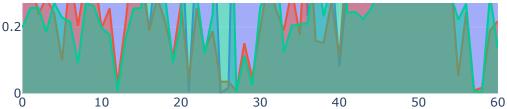


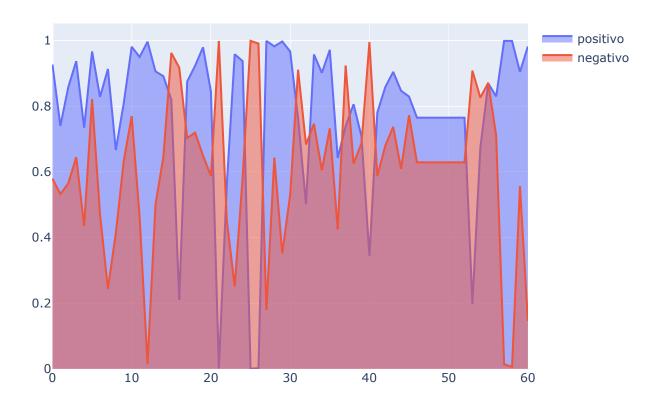
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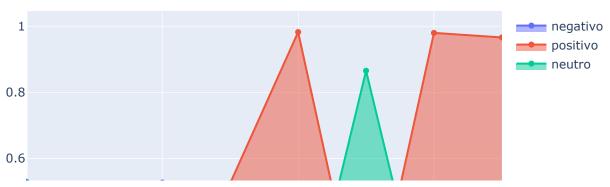
['con Cristian Madrid', 'necesito hablar a ver la que me mandó la carta fue Carla

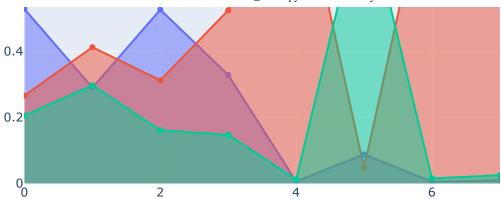


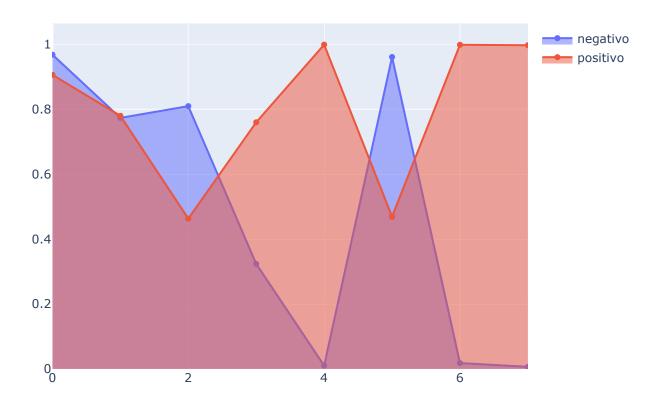




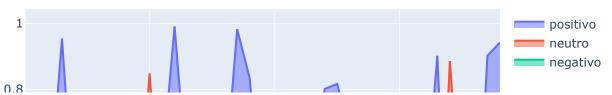
['Real Madrid unas caras', 'de parte de quién', 'de qué producen el trabado', 'un

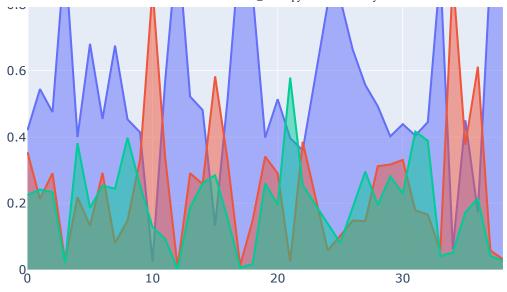


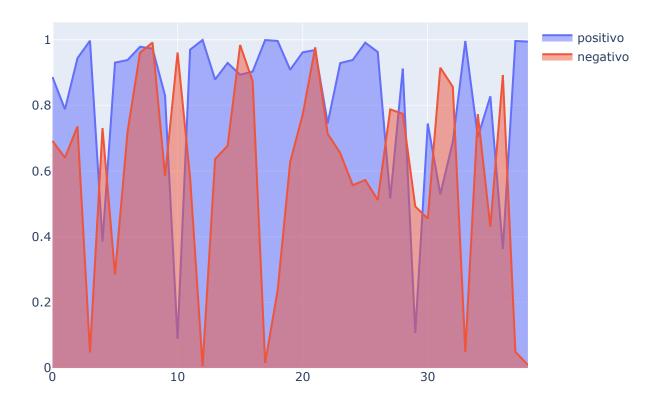




['Christian Madrid', 'Mira a ver si me explico has de cuenta', 'a principios de 1

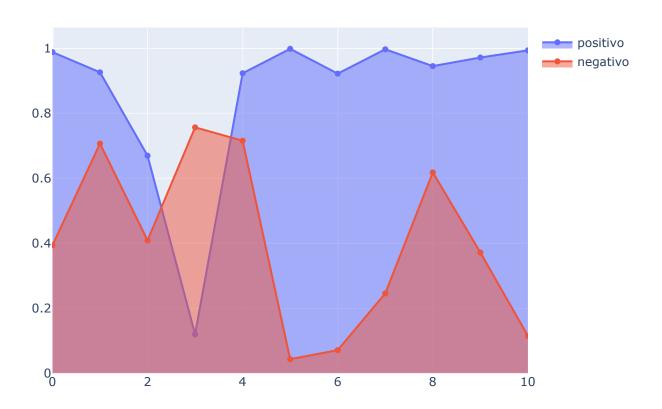




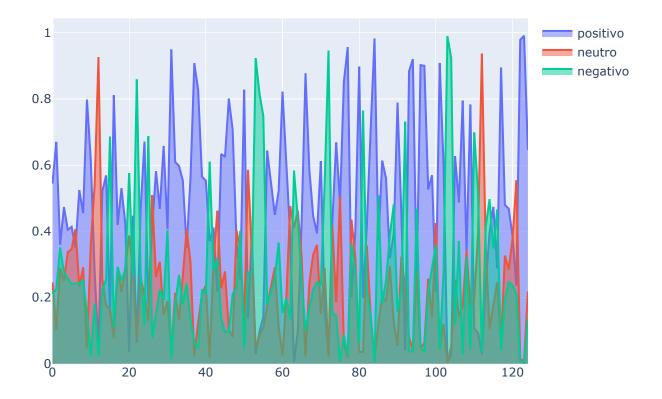


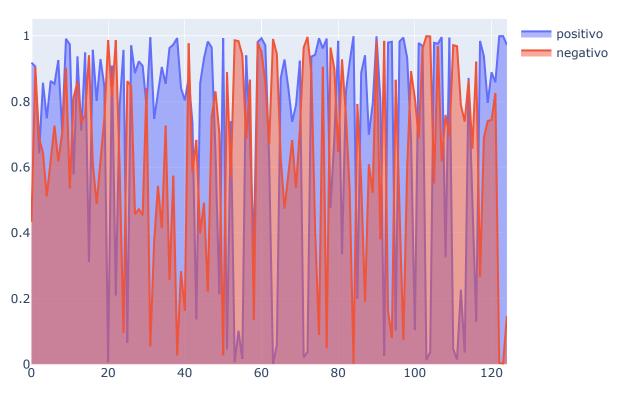
['Y si ya quisiera pagar ya bien mis mensualidad señorita sí se puede', 'en octul



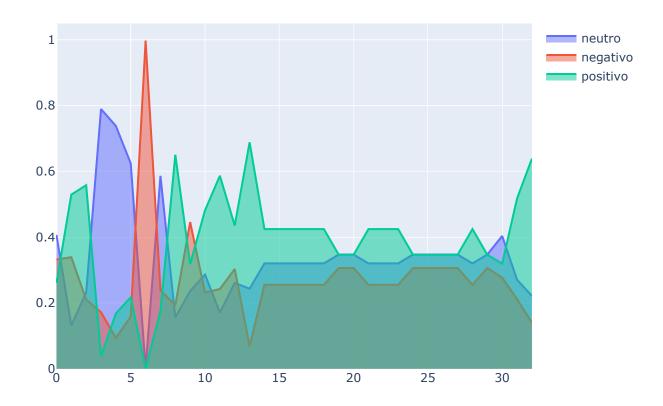


['con Carmen bretón señorita', 'Nunca quisiera saber cuánto es lo que tengo que (

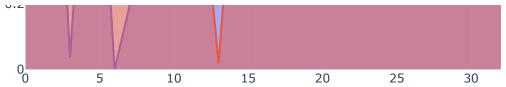




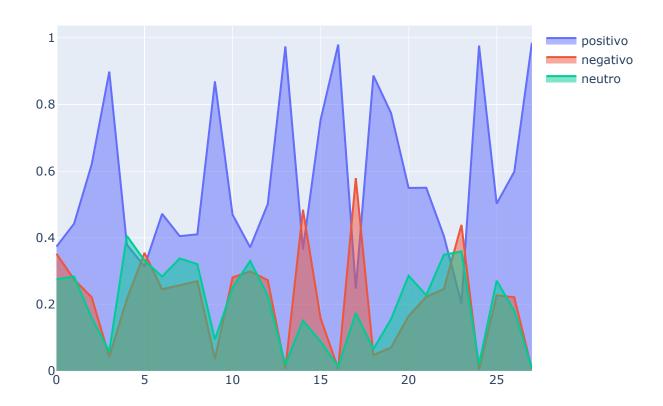
['Hola buenas noches con Yahir Salas', 'Miriam Necesito hablar con el supervisor



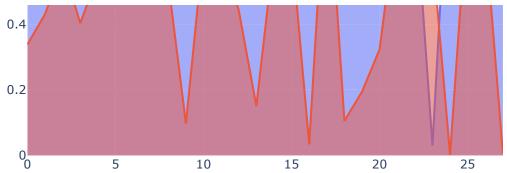




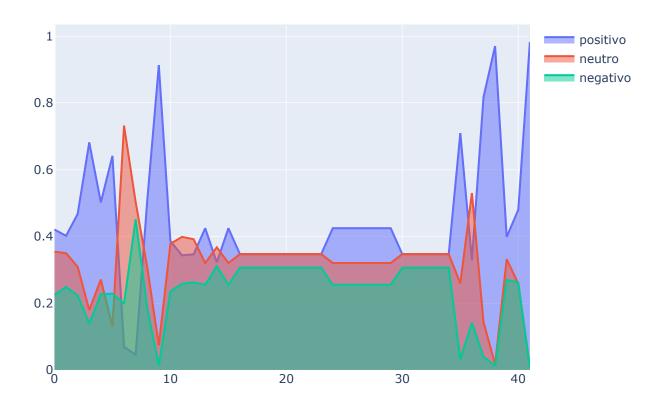
['Hola buenas tardes habla Carmen bretón', 'para saber', 'qué día me toca pagar :

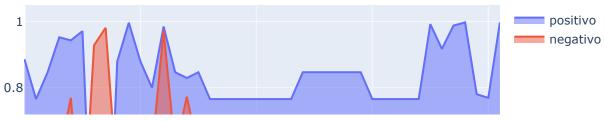


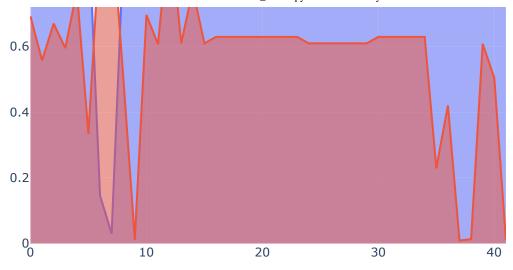




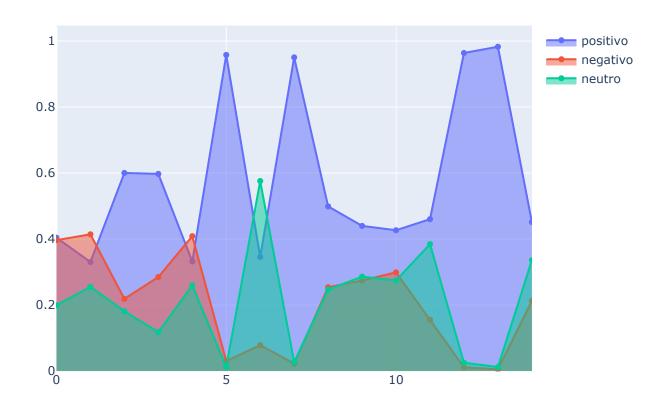
['Christian Madrid', 'Lo que pasa que hizo un trámite como de', 'renovación actua



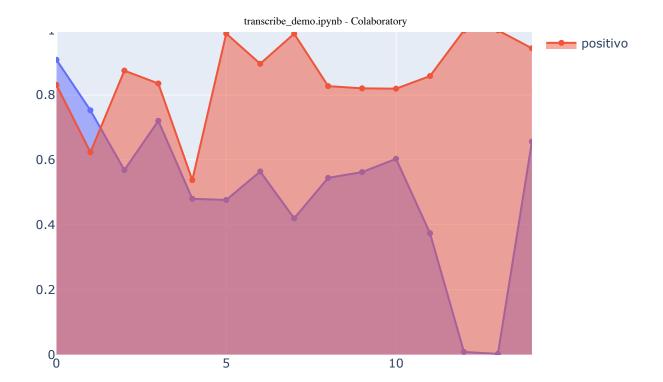




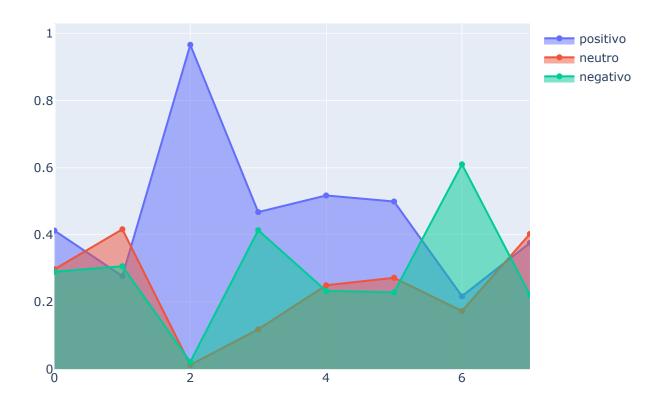
['Sí dígame', 'Dime qué pasó', 'si tienes por favor porque', 'en este momento and

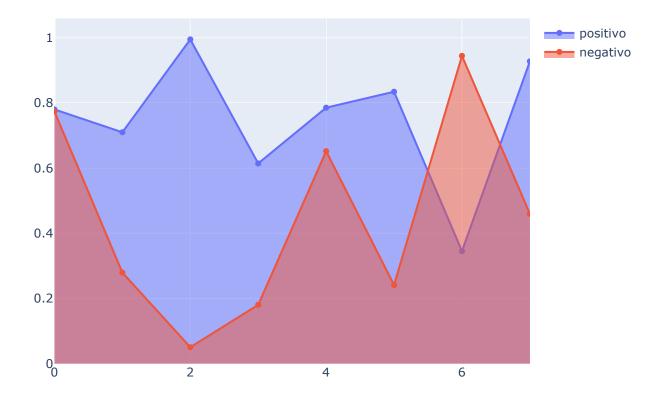


negativo –

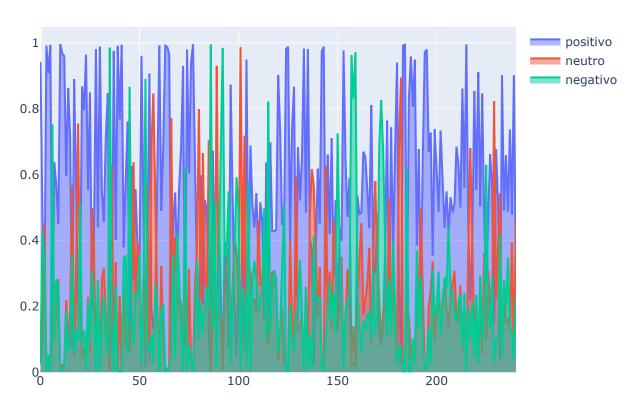


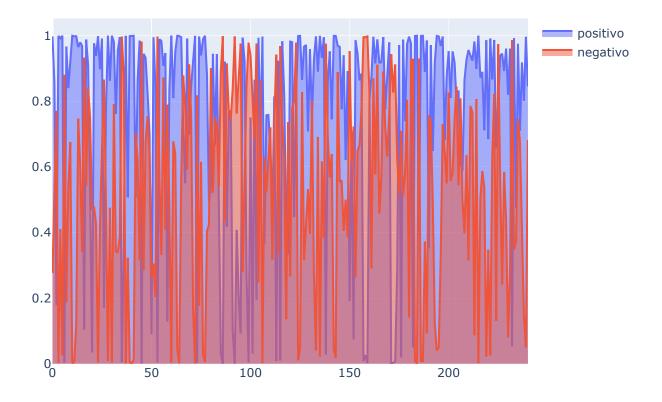
['de parte de quién', 'Hola cómo estás', 'Oye interesa mucho tu llamada', 'Supon





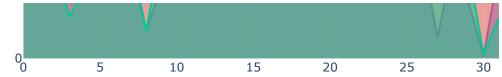
['y te confío verdad', 'Hola Antonieta Muy buenas tardes Este Si hablas con él j

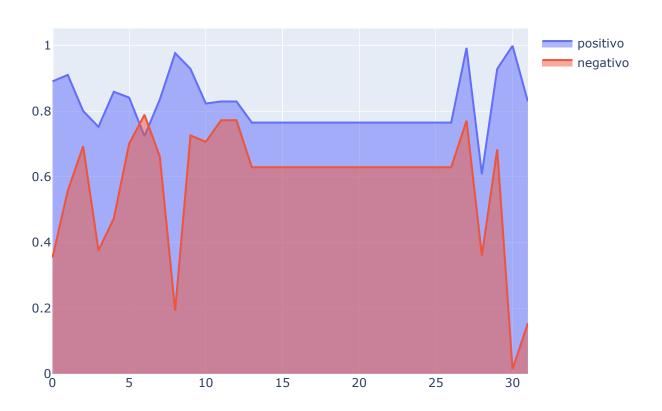




['Hola buenas tardes señorita', 'con Carmen bretón', 'Quisiera saber', 'este qui:

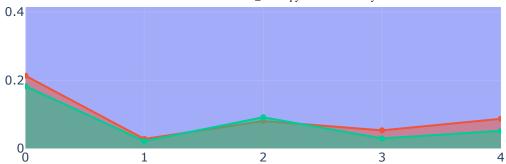


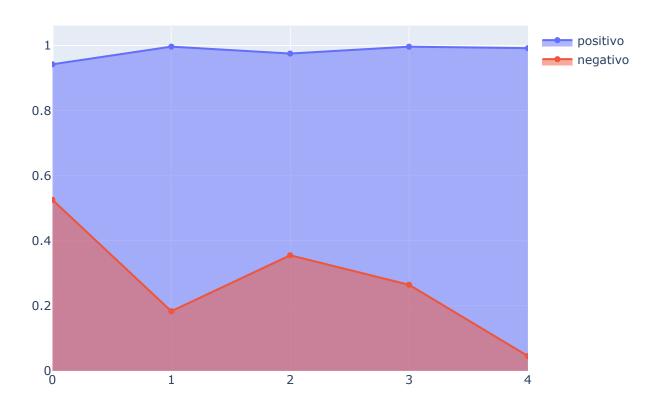




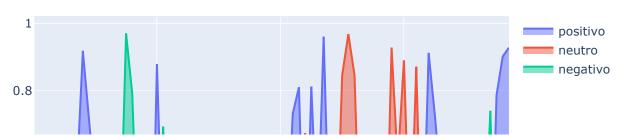
['cambiar el monto a cambiar la mensualidad', 'bueno el dinero ya está en la cue

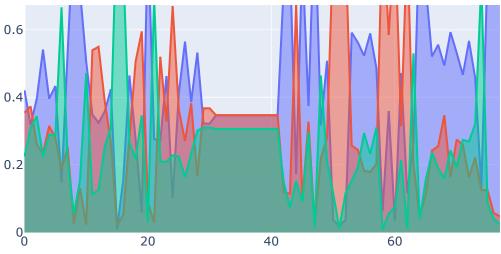


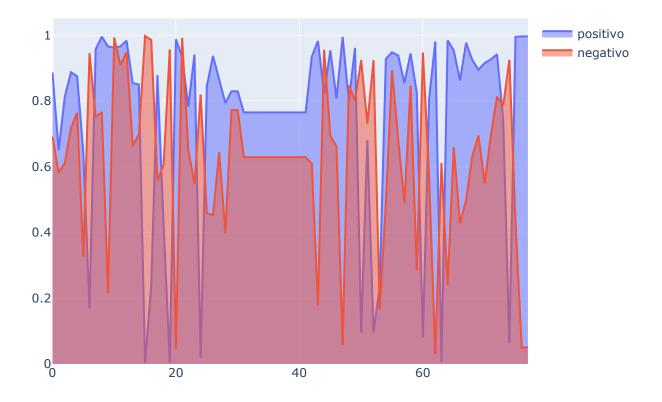




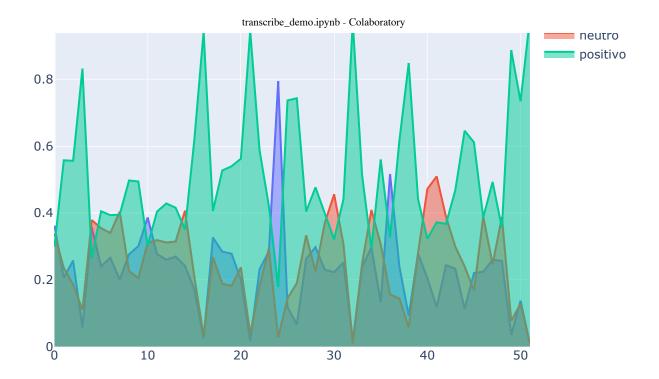
['Christian Madrid', 'es como la quinta vez que hablo', 'por chat', 'dos veces lo

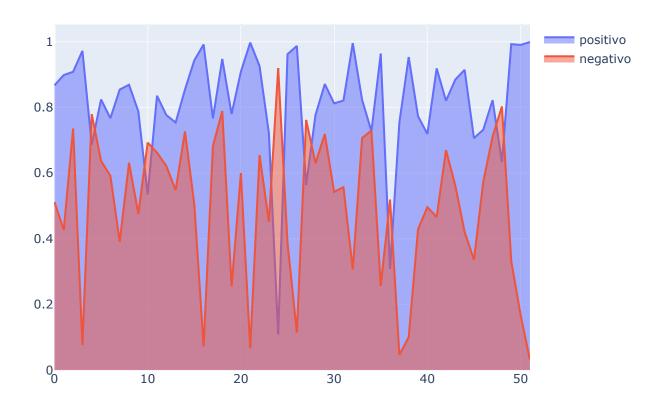




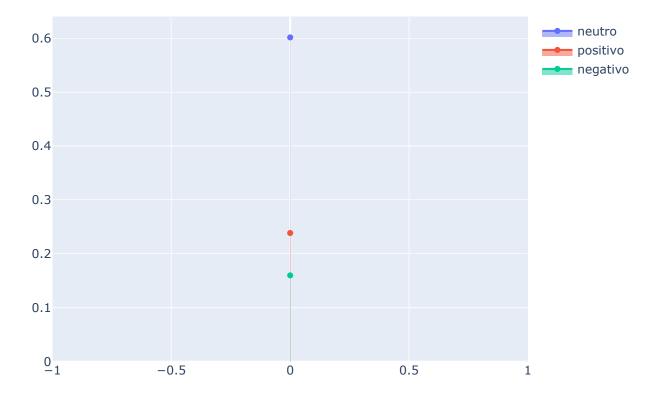


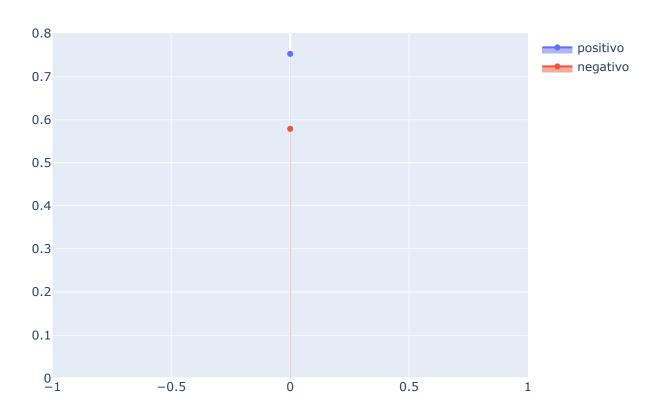
['Buenas tardes señor', 'este con Carmen bretón', 'señorita Quisiera saber cuánto



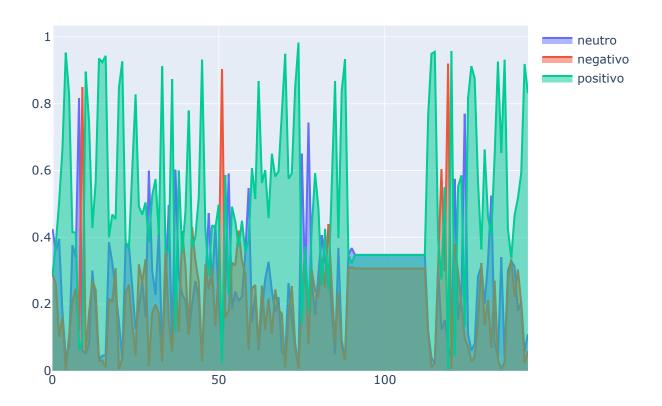


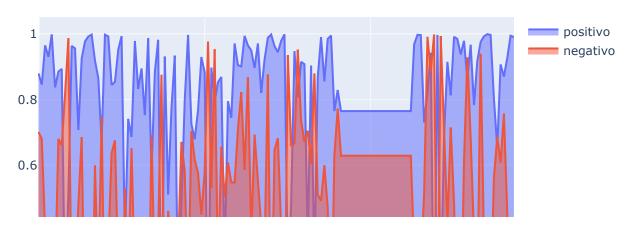
['grabe su mensaje despues del tono']





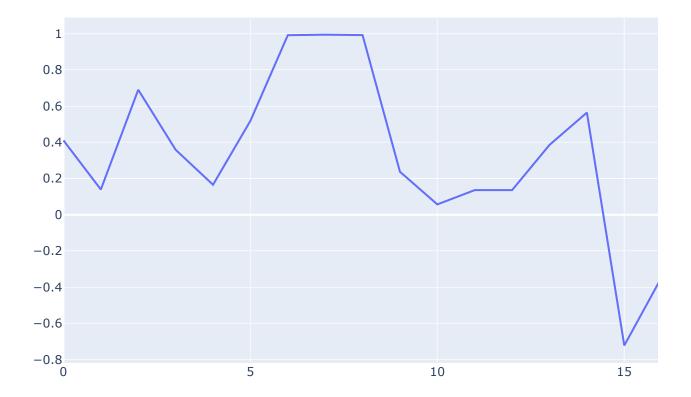
['y buenas tardes', 'Eugenio Sánchez Salas', 'vivimos aquí en la plataforma', 'u





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['Sí buenas tardes', 'habló a Eugenio', 'Mira por aquí me interesa estoy interesa

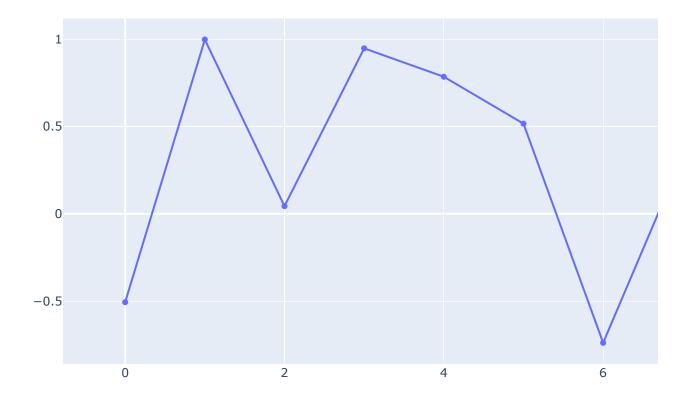


['la gripa', 'bueno', 'disculpe Es que siempre andamos acá', 'Baja California he:



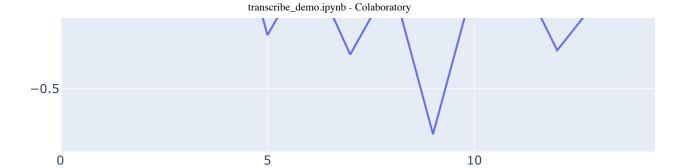


['la gripa', 'bueno', 'disculpe Es que siempre andamos acá', 'Baja California he:

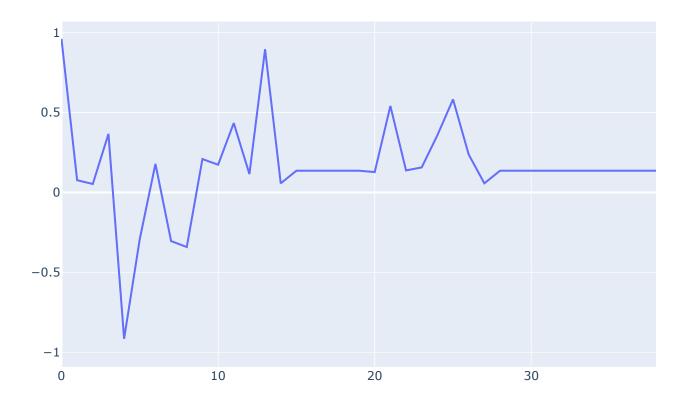


['Hola que tal Buenos días', 'Fabiola Barbosa', 'gracias gracias', 'Sí lo que pa

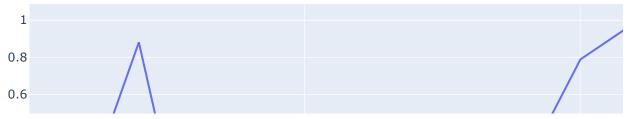




['Hola señorita buenas', 'bretón', 'Quiero ver cuánto es lo que tengo que pagar'

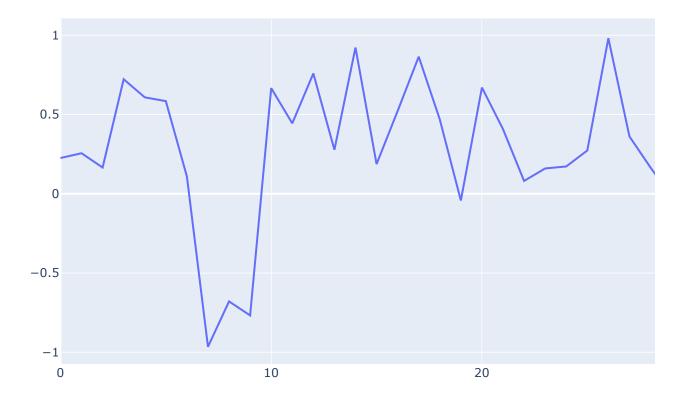


['sí que le llama No se encuentra por el momento', 'De qué empresa', 'Sí porque (

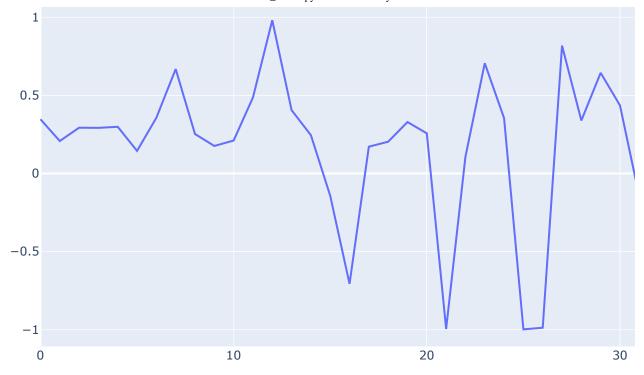




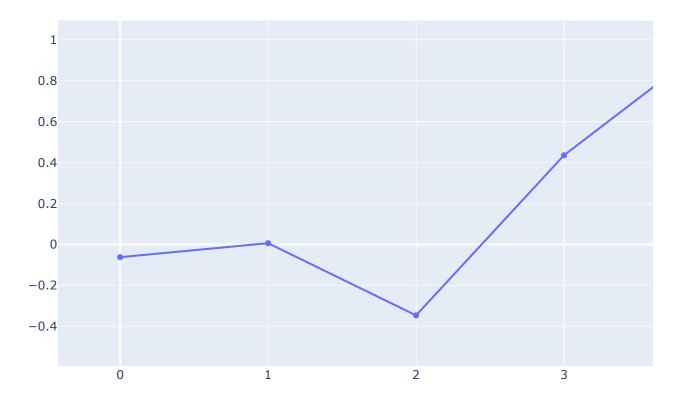
['buenas tardes', 'con', 'Eugenio Sánchez Salas', 'por ahí éste habíamos hecho',



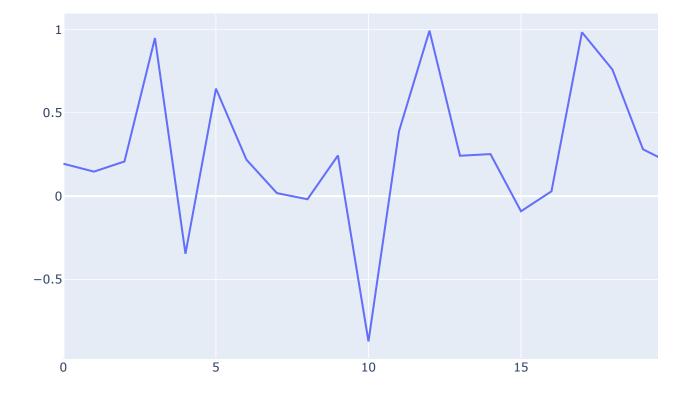
['con Cristian Madrid', 'necesito hablar a ver la que me mandó la carta fue Carla



['Real Madrid unas caras', 'de parte de quién', 'de qué producen el trabado', 'un



['Christian Madrid', 'Mira a ver si me explico has de cuenta', 'a principios de 1



['Y si ya quisiera pagar ya bien mis mensualidad señorita sí se puede', 'en octul

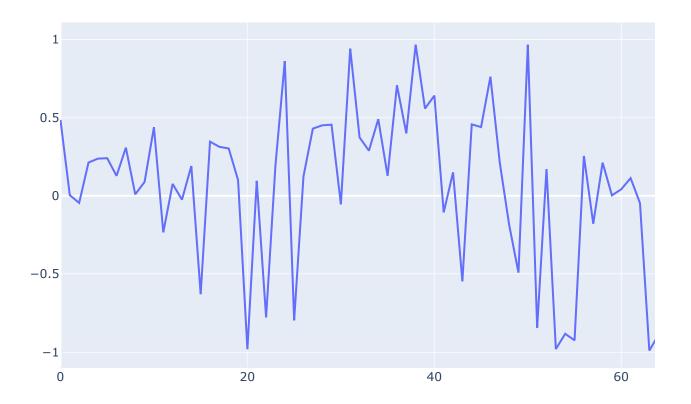


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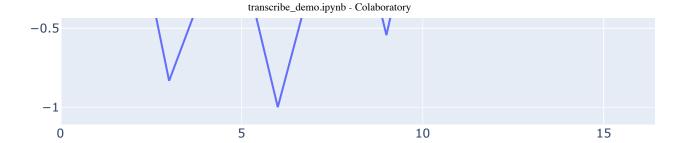
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['con Carmen bretón señorita', 'Nunca quisiera saber cuánto es lo que tengo que ϵ

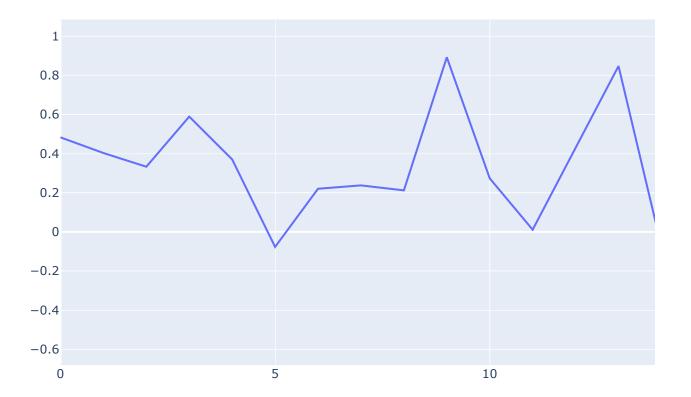


['Hola buenas noches con Yahir Salas', 'Miriam Necesito hablar con el supervisor



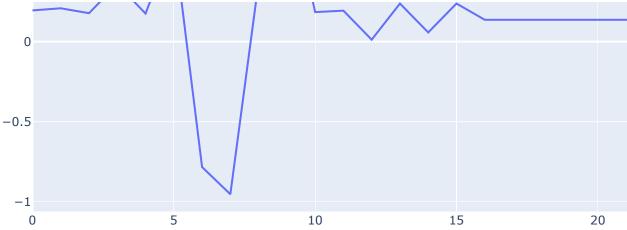


['Hola buenas tardes habla Carmen bretón', 'para saber', 'qué día me toca pagar :

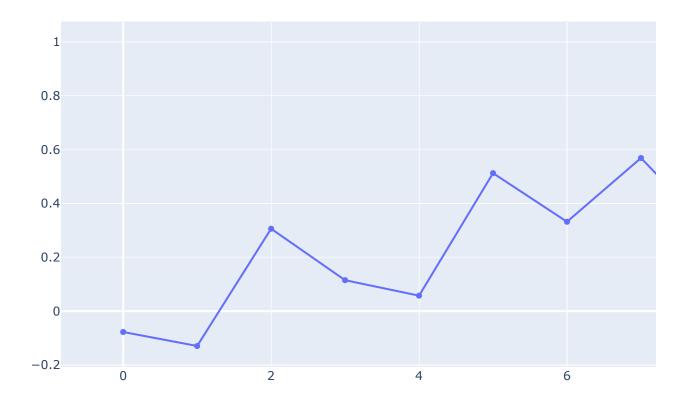


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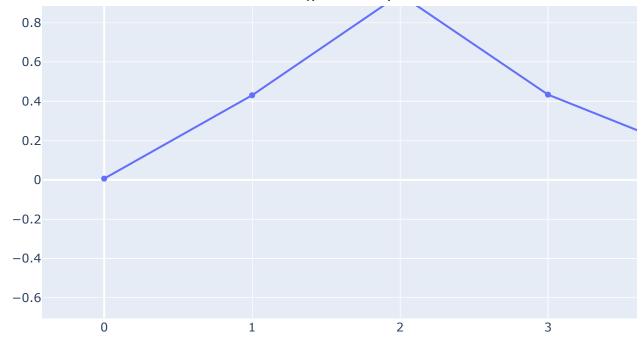




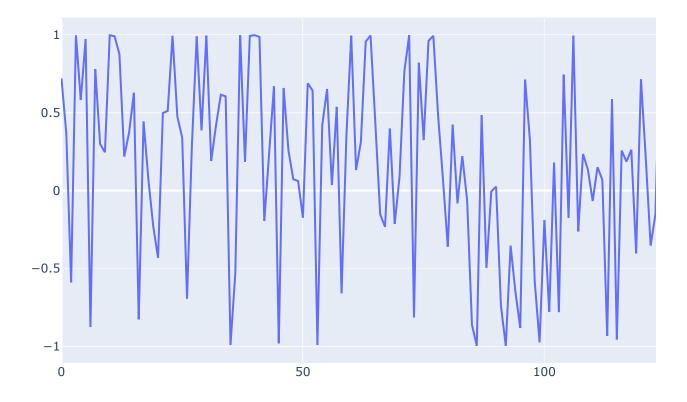
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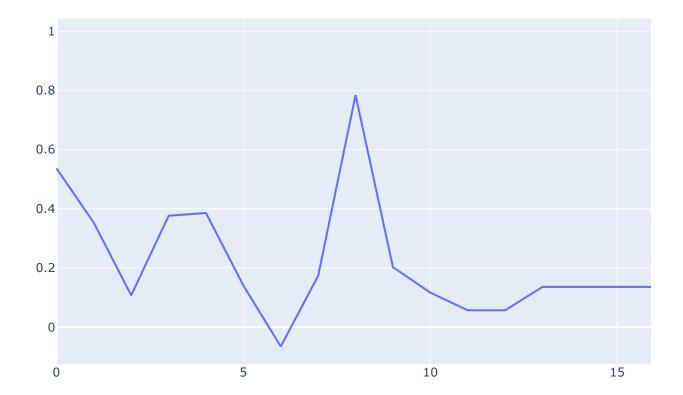
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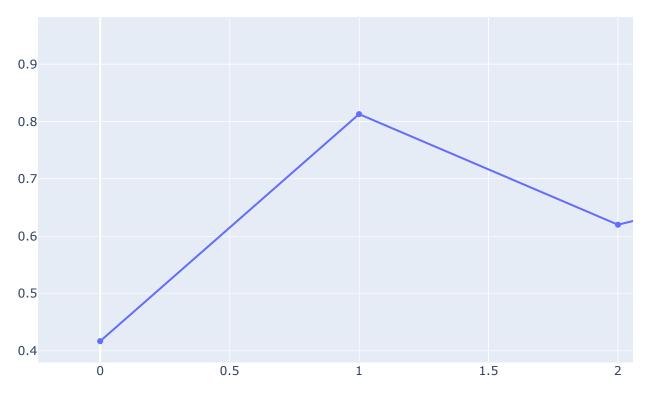
['y te confío verdad', 'Hola Antonieta Muy buenas tardes Este Si hablas con él j



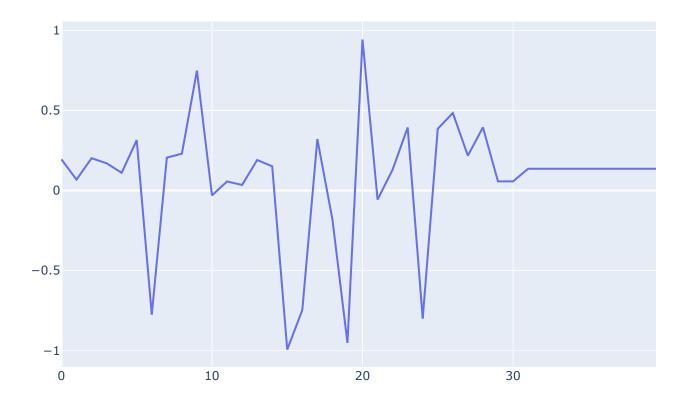
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['cambiar el monto a cambiar la mensualidad', 'bueno el dinero ya está en la cue

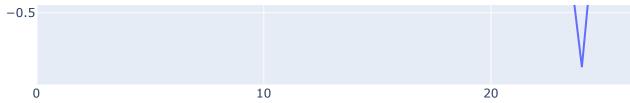


['Christian Madrid', 'es como la quinta vez que hablo', 'por chat', 'dos veces lo



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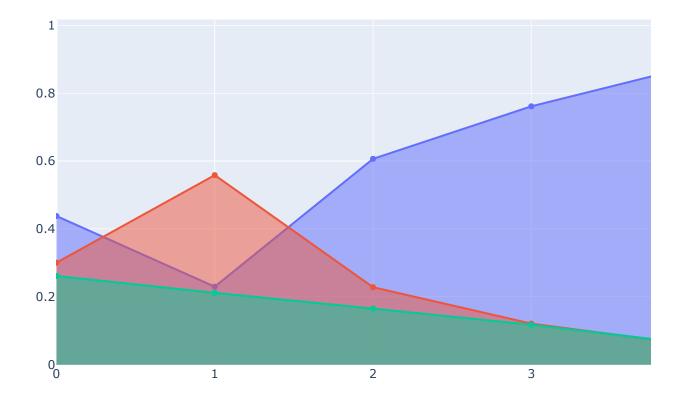


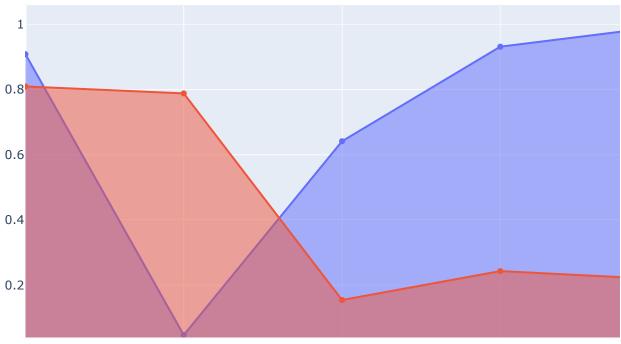
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['grabe su mensaje despues del tono']
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0.5
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```
predict binary=partial(predict,labels=['positivo','negativo'],multi class=True)
transcripts=interactions calls['client sent'].values
with Pool(8) as p:
  interactions_calls['sentiment_transcribe']=[sentiments for sentiments in tqdm(p.imar
with Pool(8) as p:
  interactions calls['sentiment binary transcribe']=[sentiments for sentiments in tqdr
     100%
                                          461/461 [16:08<00:00, 2.10s/it]
     100%
                                          461/461 [06:52<00:00, 1.12it/s]
     ['v huenas tardes' 'Eugenio Sánchez Salas' 'vivimos aguí en la nlataforma'
samples=interactions_calls[interactions_calls.sentiment.notnull()][['client_sent','ser
for sample in samples.to_dict('records'):
  print(sample['client sent'])
 plot lines(sample['sentiment transcribe'])
 plot lines(sample['sentiment binary transcribe'])
C→
```

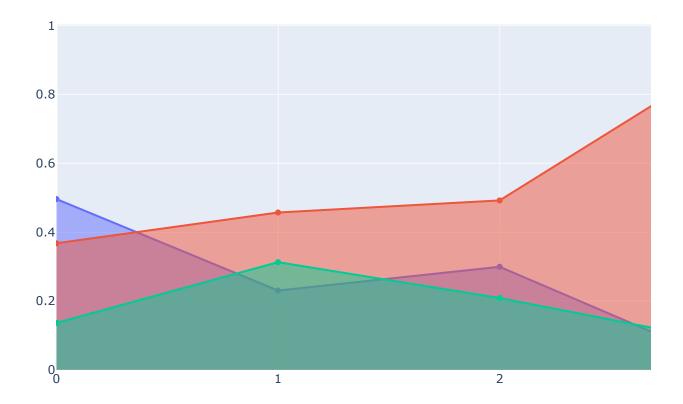
['Sí , Buenas tardes . Este hablo un genio . Mire por aquí . Me estoy interesado

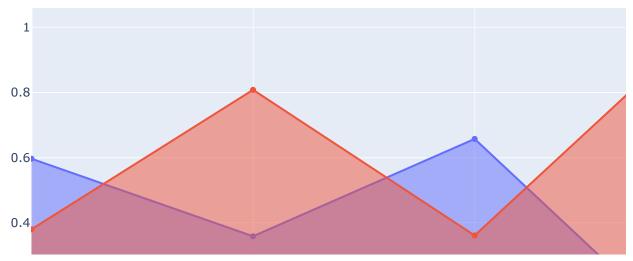




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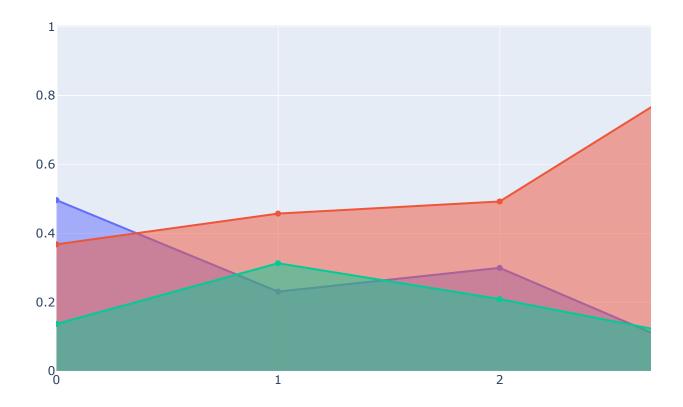
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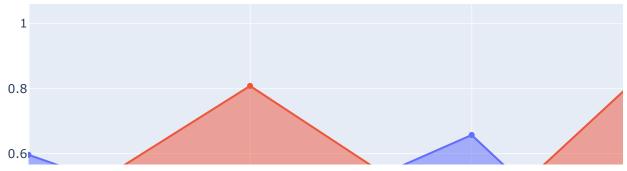


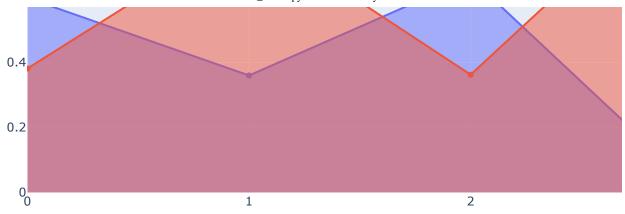




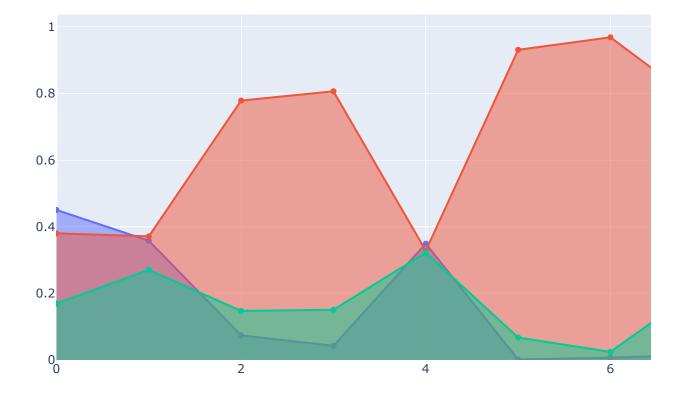
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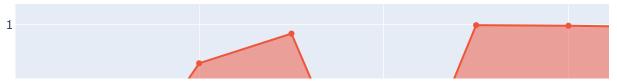


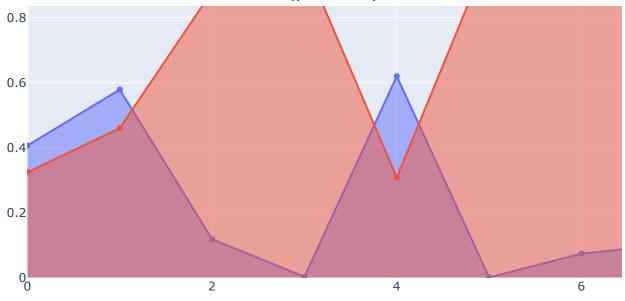




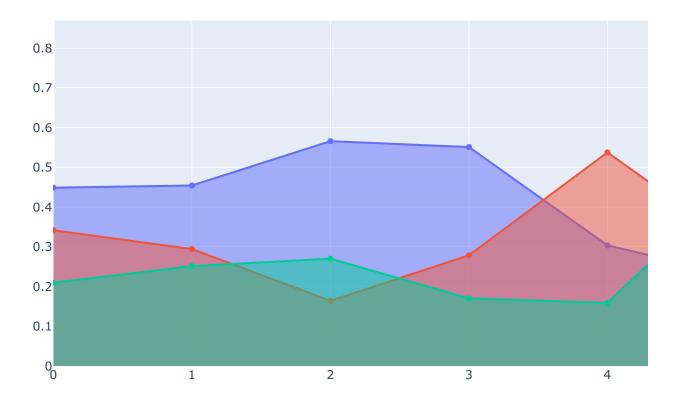
['Hola , Que tal ? Buenos días . Como todavía no me gusta . Gracias .]

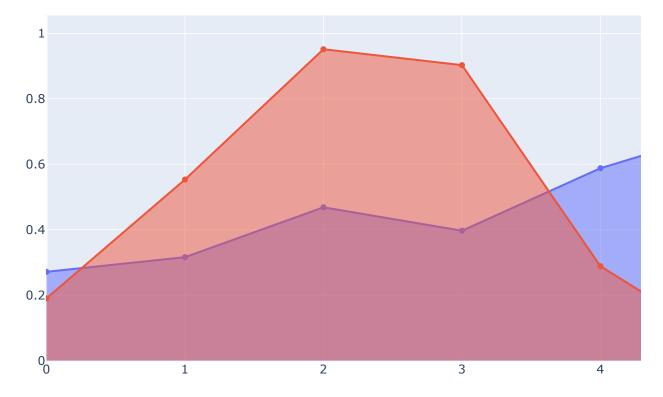




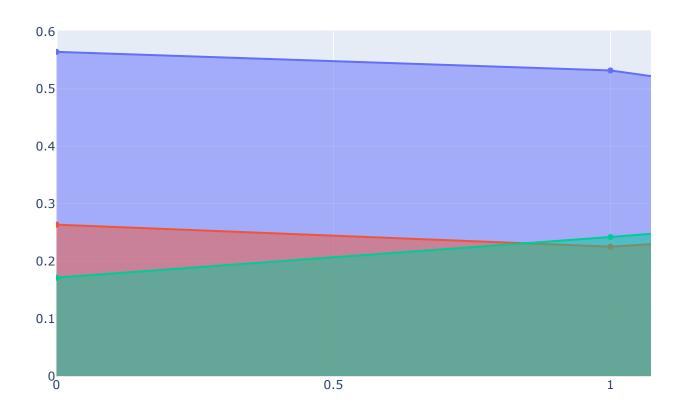


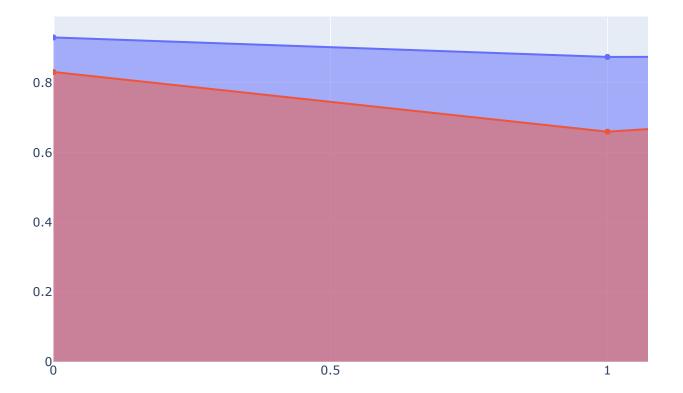
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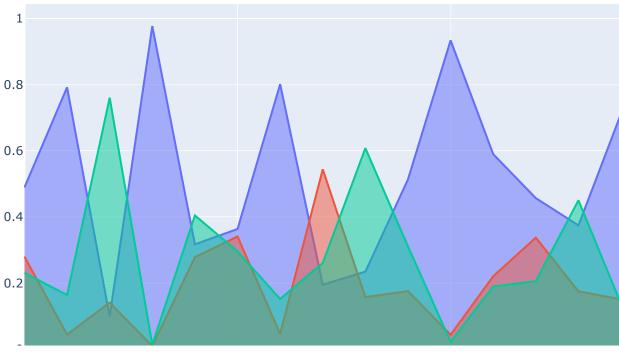


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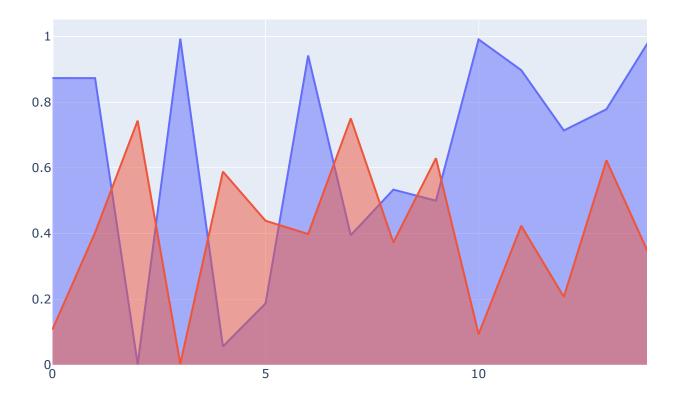




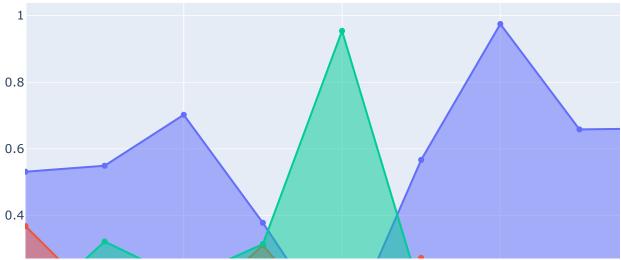
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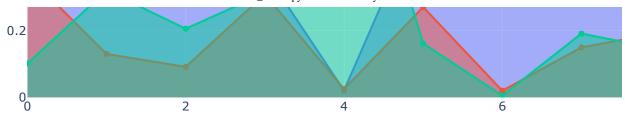


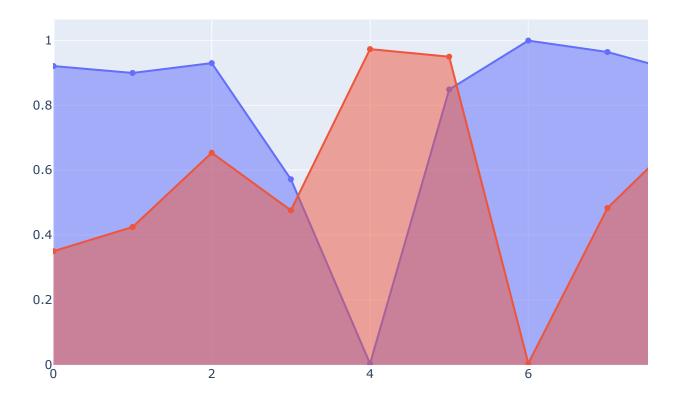
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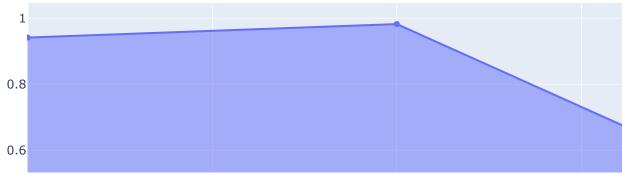
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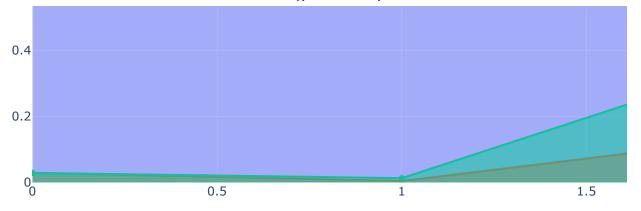


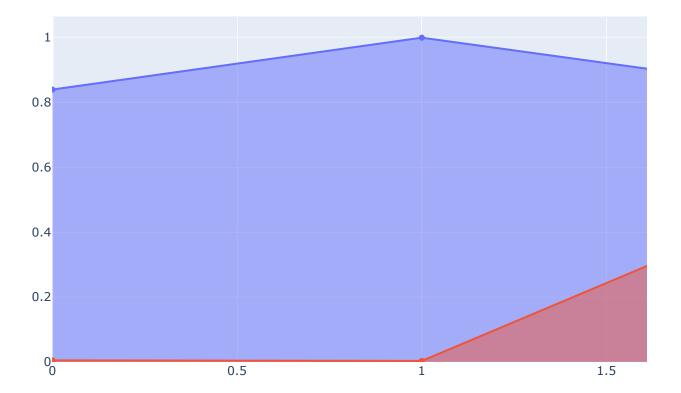




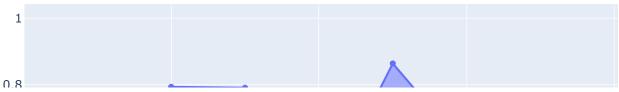
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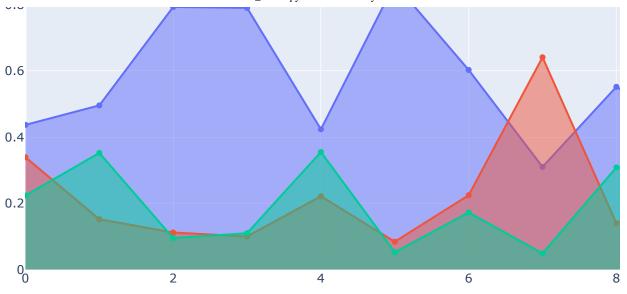


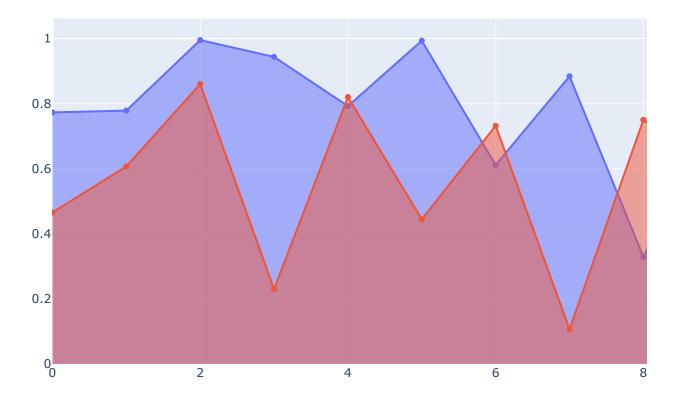




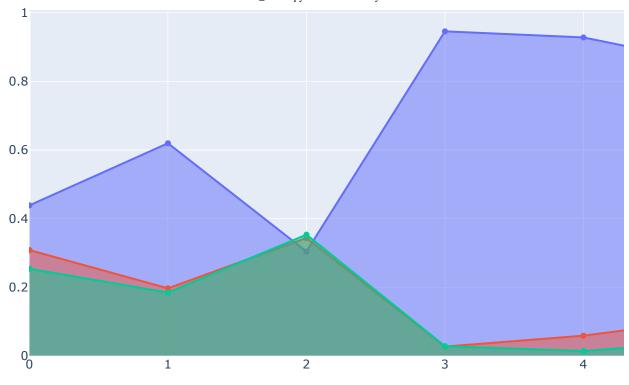
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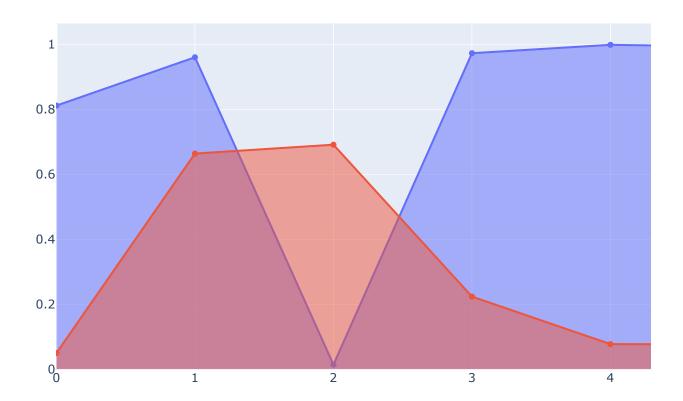




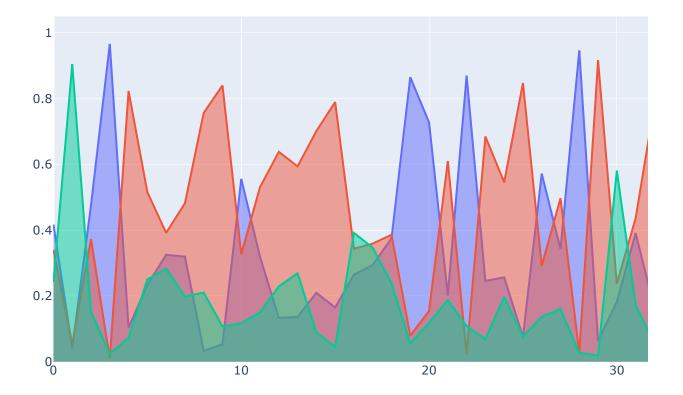


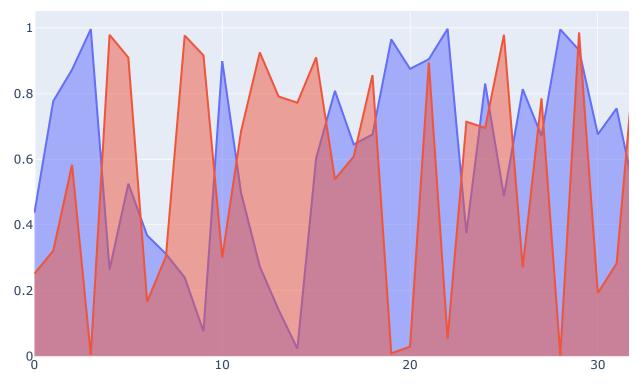
['Bueno , Hola . Buenas . Si , señorita , la escucho .', 'Y si ya quisiera pagar



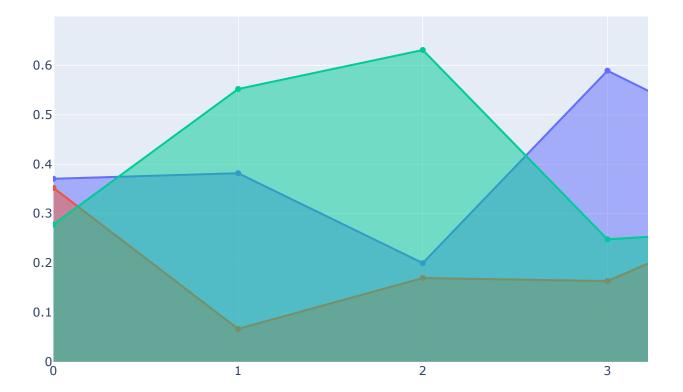


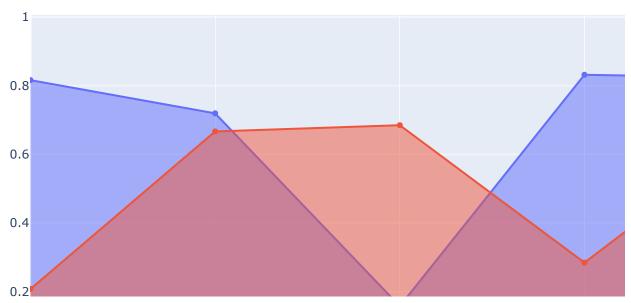
['Aló con Carmen Bretón . Señorita , ahorita quisiera saber cuánto es lo que ten





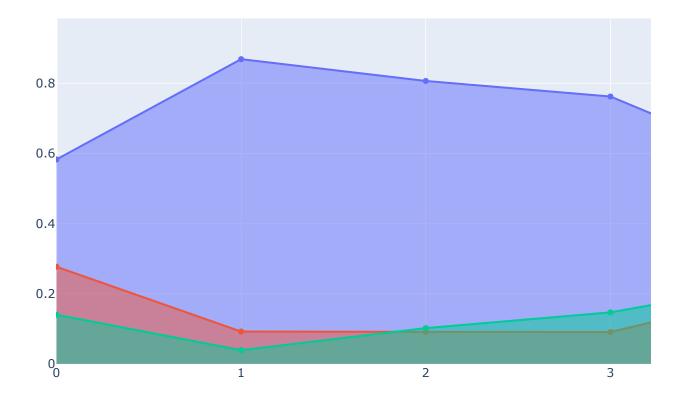
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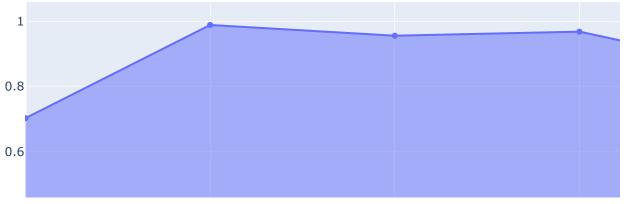


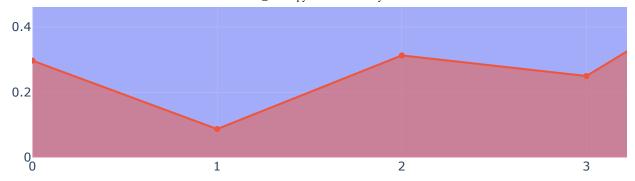




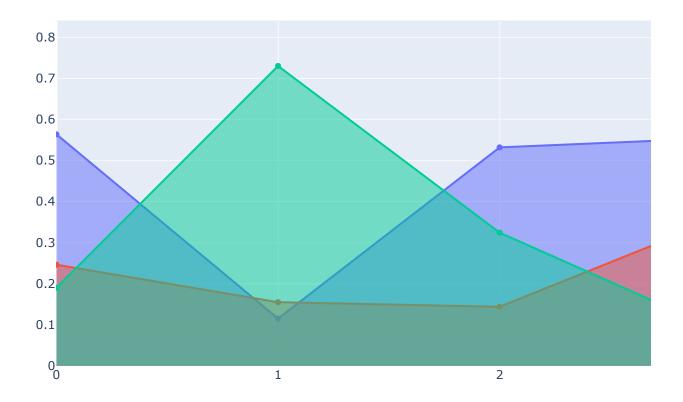
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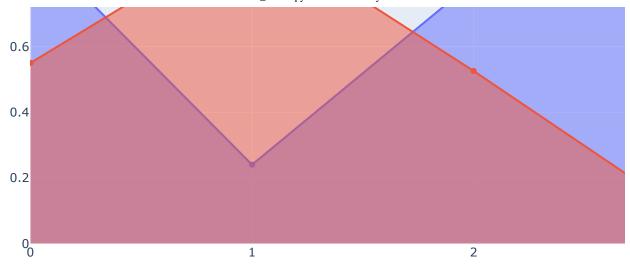




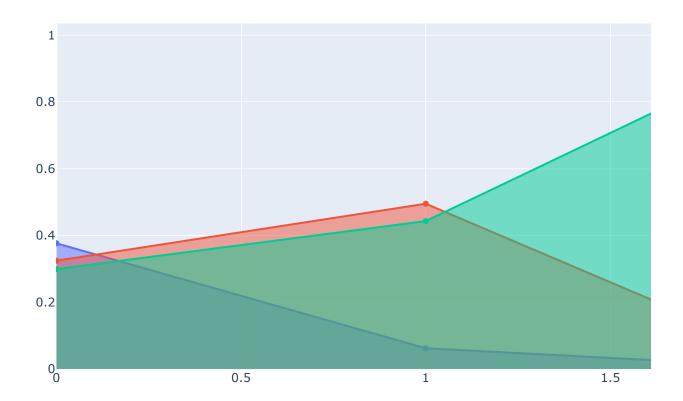
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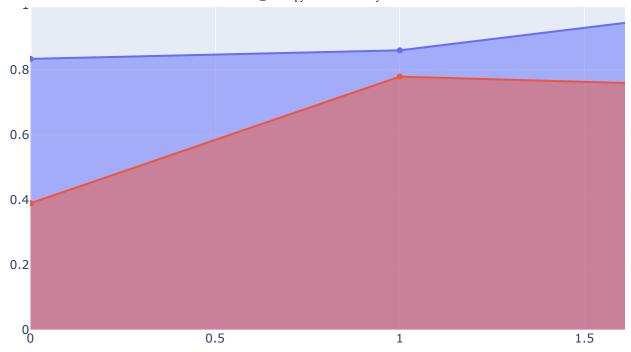




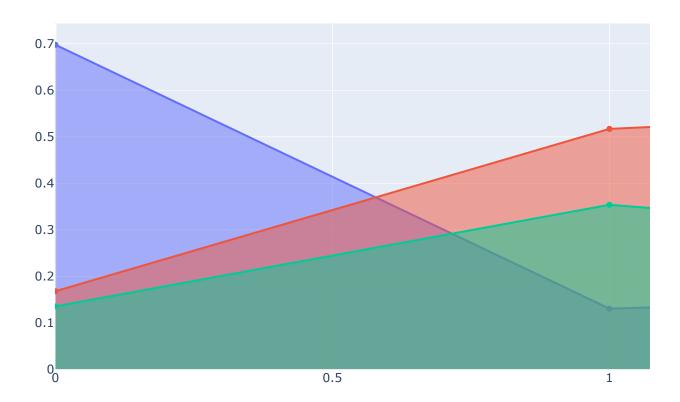


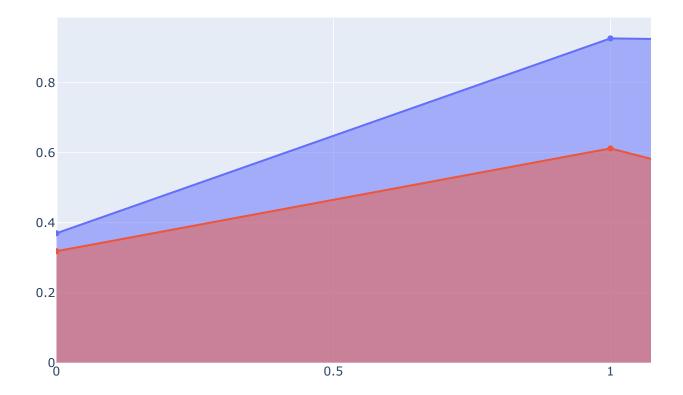
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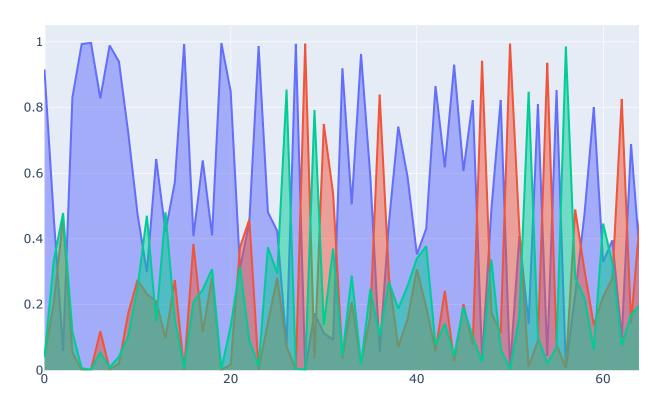


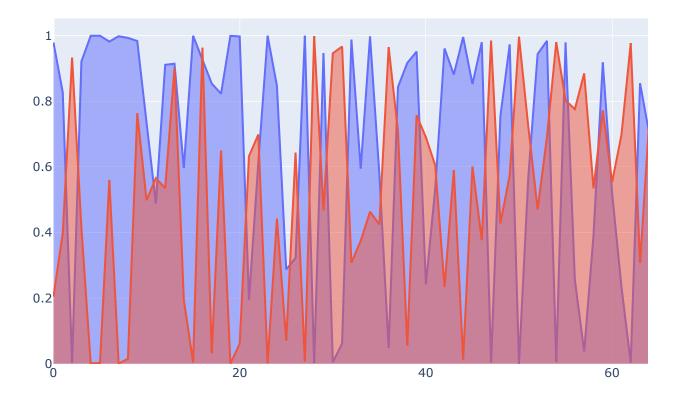
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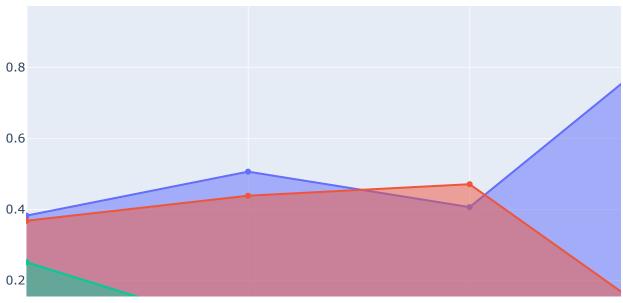


['Sí le confío , verdad ? Hola , Antonieta . Muy buenas tardes . Este si hablas ϵ

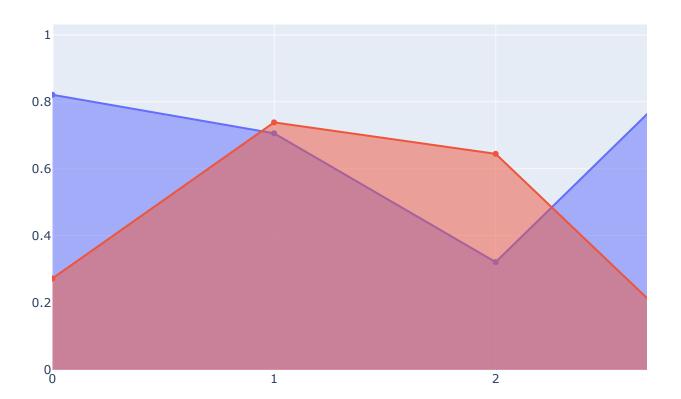




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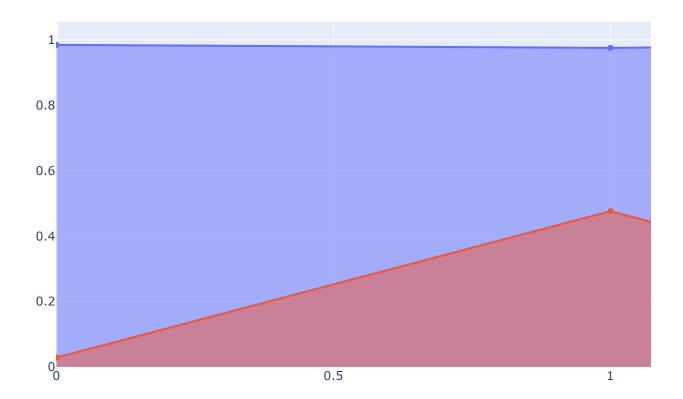




['Bueno , okay . Dígame . Sí , sí , sí . Ajá .', 'Porque entonces a cambiar el mo

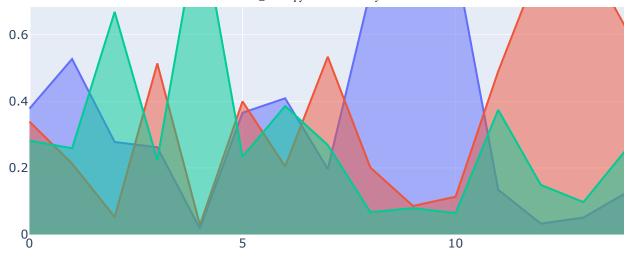


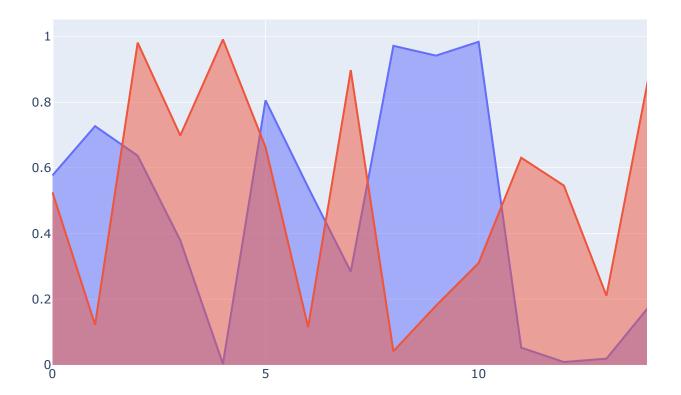




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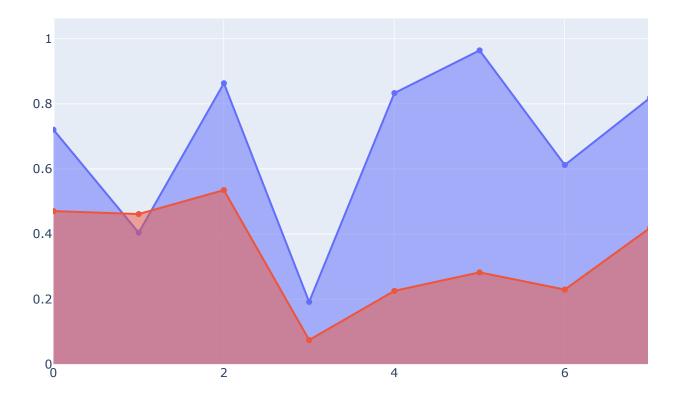




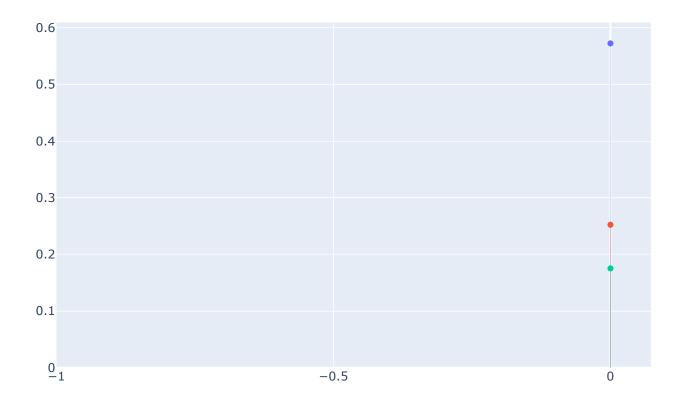


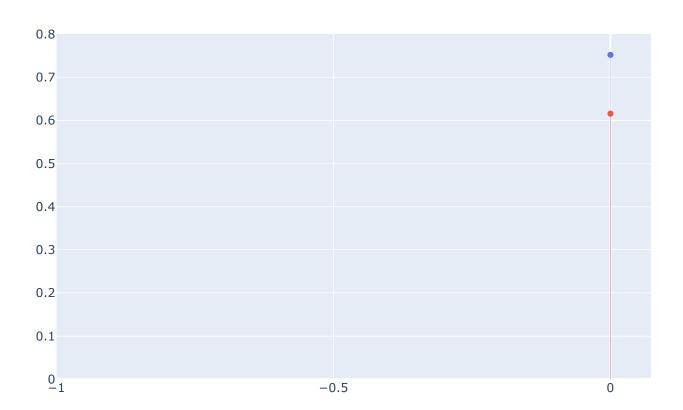
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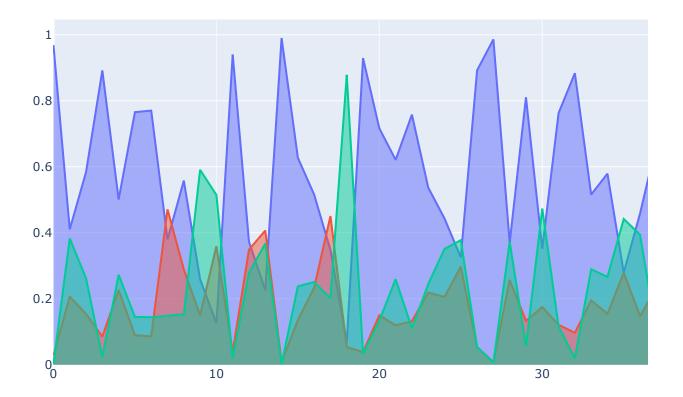


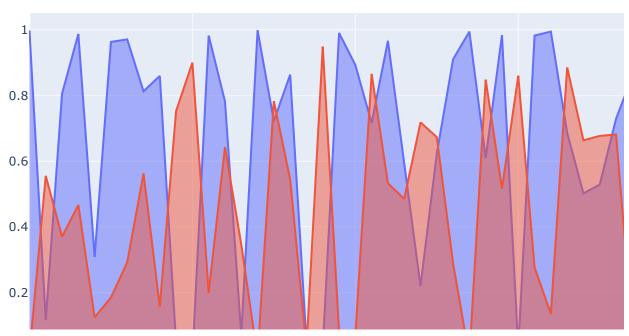
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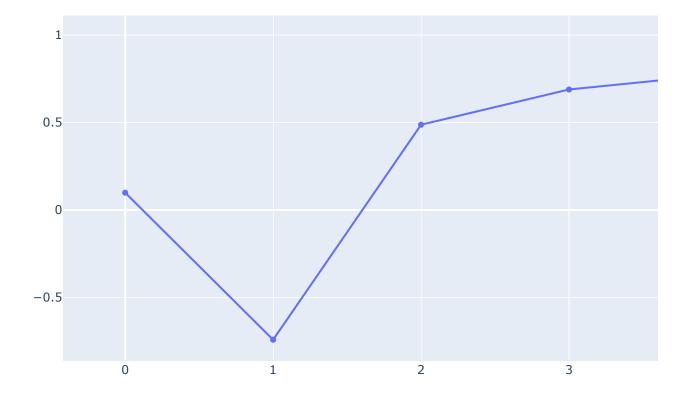


['y buenas tardes , eh , Eugenio Sánchez Salas . Sí , mire , vivimos aquí en la $_{
m I}$





['Sí , Buenas tardes . Este hablo un genio . Mire por aquí . Me estoy interesado



['así sería la gripe . Buenas tardes . Quién la busca ? Perdón ? De dónde ? Perdo

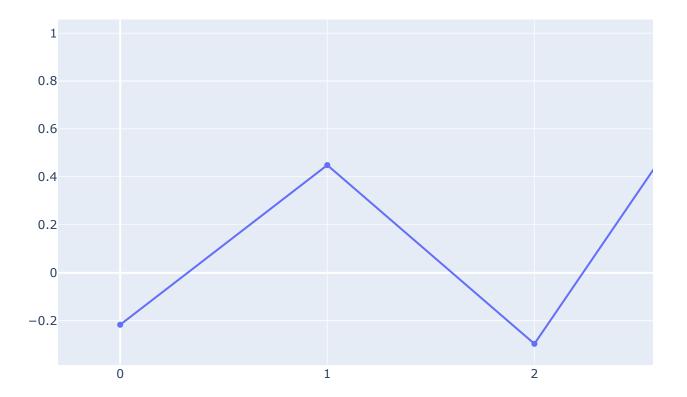


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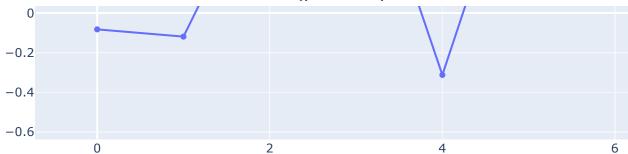
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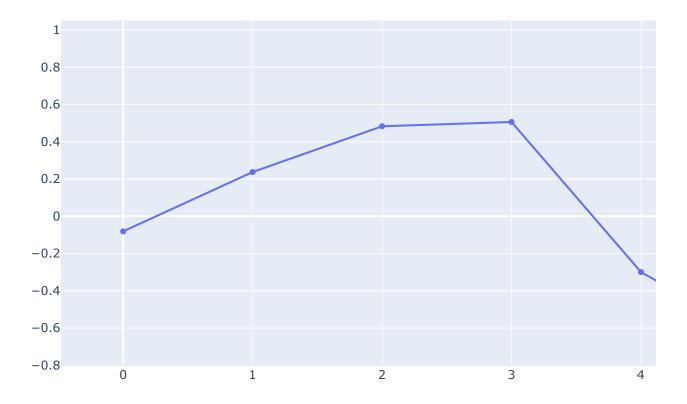


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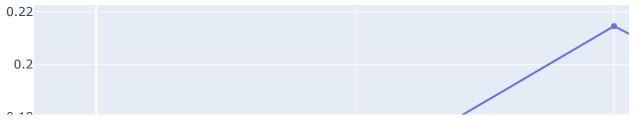


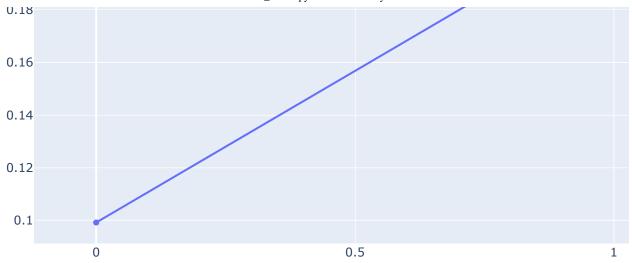


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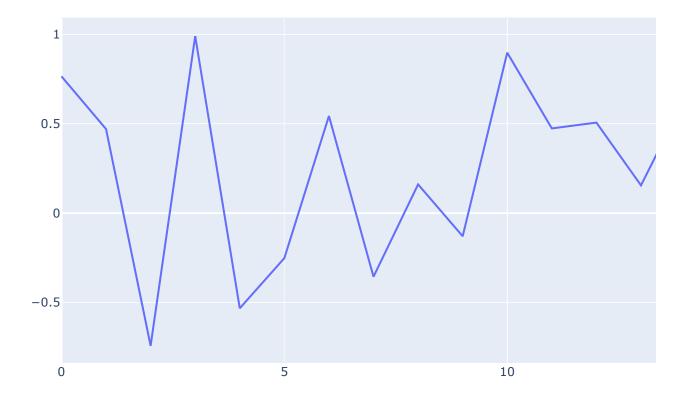


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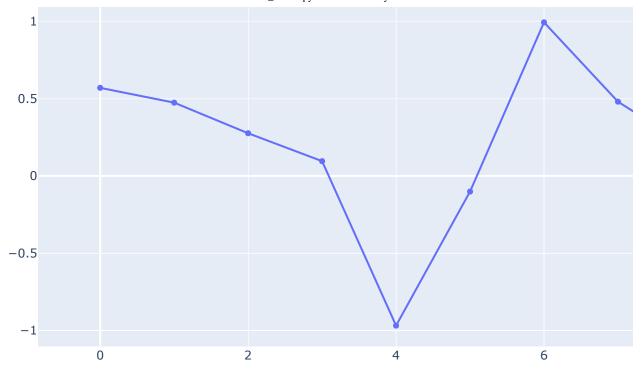




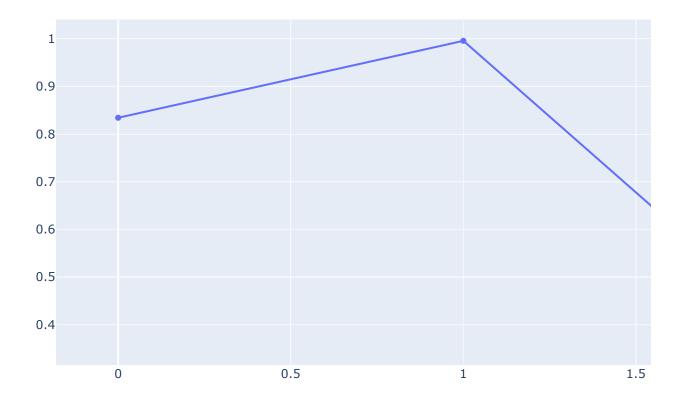
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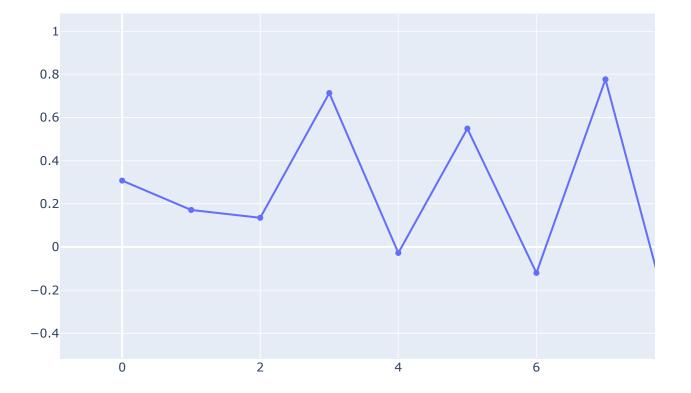
['concreción . Madrid .', 'Necesito hablar a verla que me mandó la carta . Fue ${\tt Ki}$



['sería un cuadrito . Unas tres . De parte de quién ? De qué producto ? Se me he



['con Cristian Madrid . Mira a ver si me explico .', 'Hace en cuenta que a princ



['Bueno , Hola . Buenas . Si , señorita , la escucho .', 'Y si ya quisiera pagar



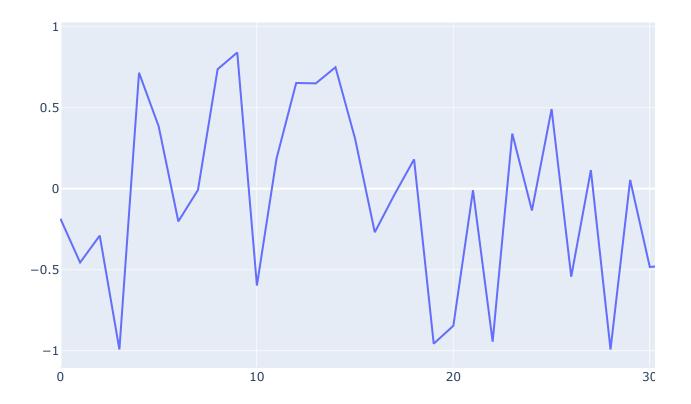
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['Aló con Carmen Bretón . Señorita , ahorita quisiera saber cuánto es lo que tene

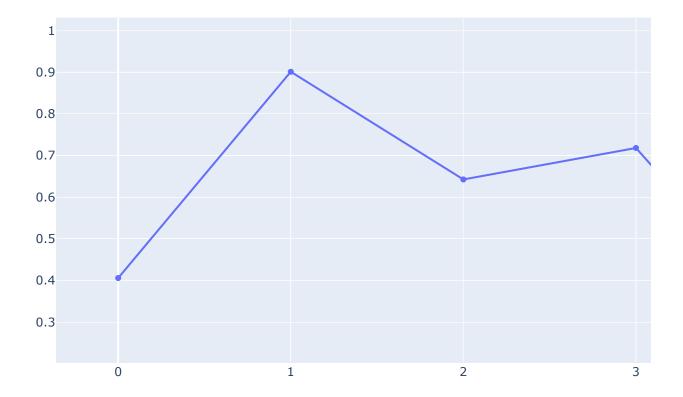


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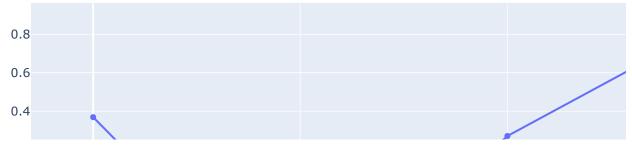


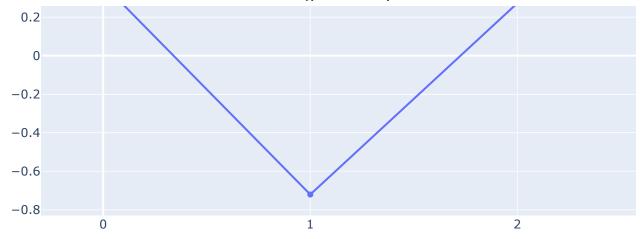


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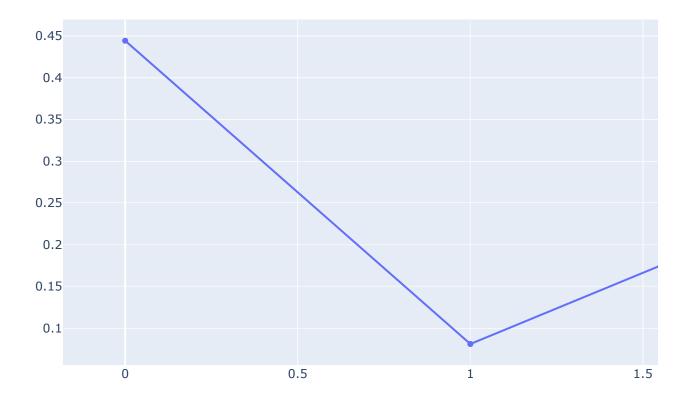


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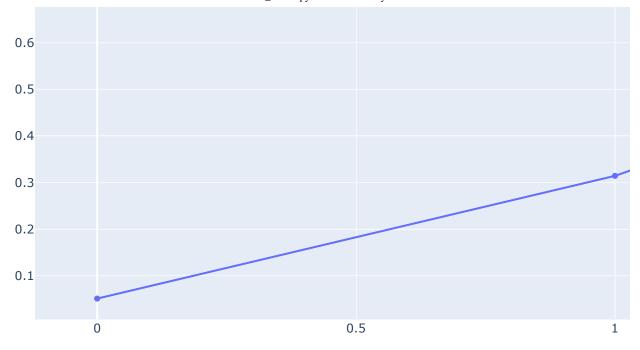


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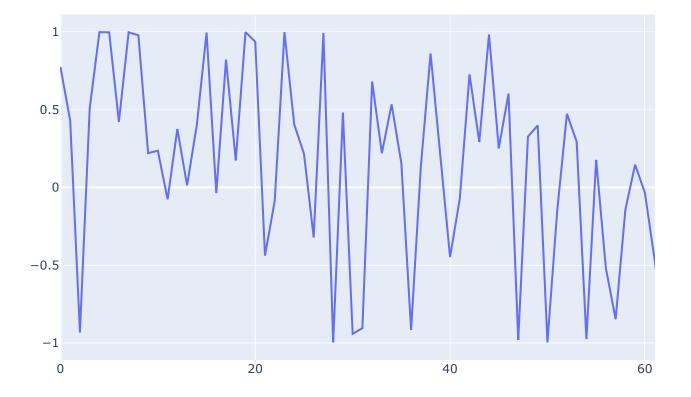


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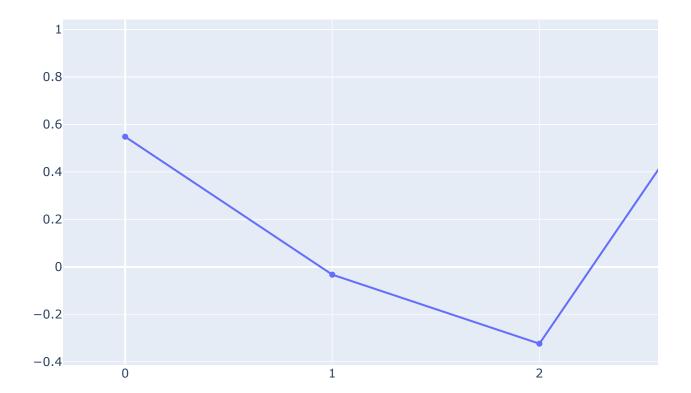
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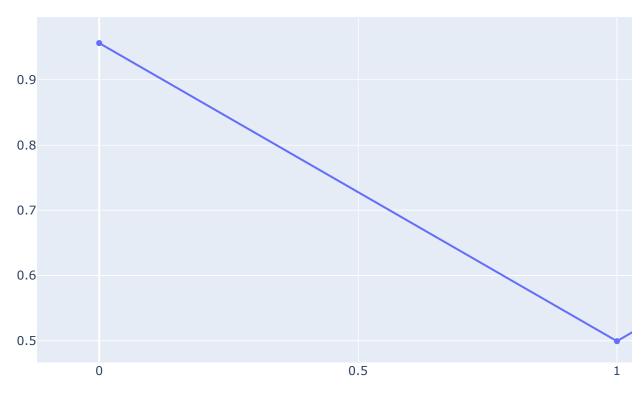
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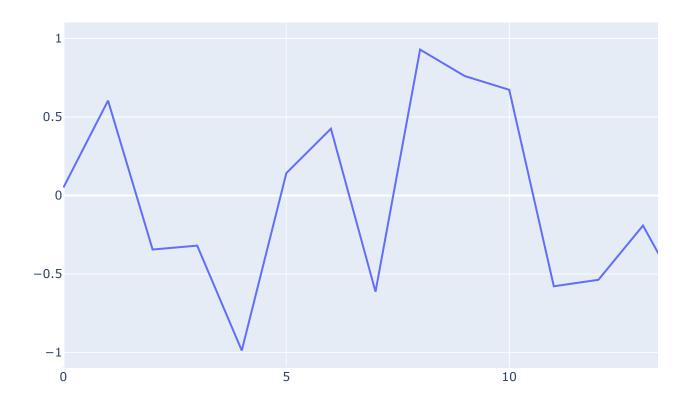
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['Bueno , okay . Dígame . Sí , sí , sí . Ajá .', 'Porque entonces a cambiar el mo



['con Cristian Madrid . Mire , señorita , es como la quinta vez que hablo y por ${}^{\scriptscriptstyle (}$

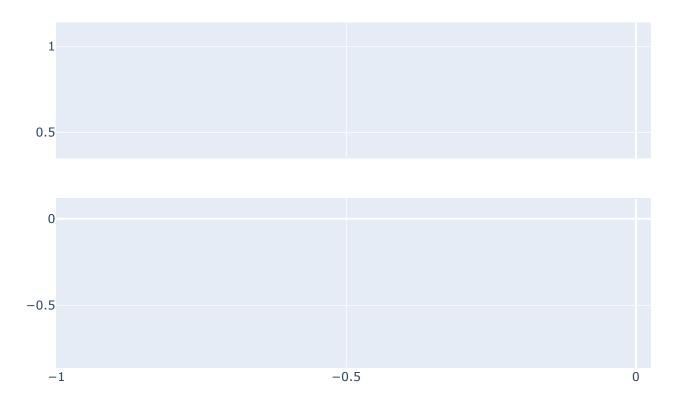


['Buenas tardes , señor . Este con Carmen Bretón . Carmen Bretón . Hola , señori





['grabe su mensaje después del tono .']



['y buenas tardes , eh , Eugenio Sánchez Salas . Sí , mire , vivimos aquí en la]

