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```
In [1]: import numpy as np
import json
import matplotlib.pyplot as plt
from tqdm import tqdm
import random
import subprocess
import time
import pandas as pd
import os
```

Read the data

Perform compression for bundled approach

```
In [17]: def log(file, msg):
    f = open(file, 'a+')
    f.write(msg + '\n')
    f.close()

def get_seconds(time):
    min_ind = time.find('m')
    mins = int(time[:min_ind])
    second = float(time[min_ind + 1:-1])
    return mins * 60 + second

n [219]: rates_gzip_bundled = []
    rates_brotli_bundled = []
    times_gzip_bundled = []
```

```
In [219]: rates gzip bundled = []
          times brotli bundled = []
          speed gzip bundled = []
          speed brotli bundled = []
          init sizes bundled = []
          for i in range(4000):
              rates gzip compressed = []
              rates brotli compressed = []
              times gzip compressed = []
              times brotli compressed = []
              speed gzip compressed = []
              speed brotli compressed = []
              # write the text of a bundle to file to use it for compression
          later
              with open("example.txt", "w") as file:
                  file.write(splitted data[i])
              size non compressed = os.stat("example.txt").st size
              init sizes bundled.append(size non compressed)
              # do the gzip compression with different levels
              for level in range(4, 10):
                  result = subprocess.run(["bash", "gzip compress.sh", str(le
          vel), "time.txt",
                                            "example gzip.txt.gz", "example.tx
          t"])
                  #previous script saves the time into the file
                  with open("time.txt") as file:
                      user sys = file.read().strip().split('\n')[1:]
                  time = get seconds(user sys[0].split('\t')[1]) + get second
          s(user sys[1].split('\t')[1])
                  size gzip compressed = os.stat("example gzip.txt.gz").st si
          ze
                  rates_gzip_compressed.append(size_non_compressed / size_gzi
          p compressed)
                  times gzip compressed.append(time)
                  speed gzip compressed.append(size non compressed / time)
              # do the brotli compression with different levels
```

```
for level in range(4, 12):
        result = subprocess.run(["bash", "brotli compress.sh", str(
level), "time.txt",
                                 "example brotli.txt.br", "example.
txt"])
        with open("time.txt") as file:
            user sys = file.read().strip().split('\n')[1:]
        time = get seconds(user sys[0].split('\t')[1]) + get second
s(user sys[1].split('\t')[1])
        size br compressed = os.stat("example brotli.txt.br").st si
ze
        rates brotli compressed.append(size non compressed / size b
r compressed)
        times brotli compressed.append(time)
        speed brotli compressed.append(size non compressed / time)
    rates gzip bundled.append(rates gzip compressed)
    rates brotli bundled.append(rates brotli compressed)
    times gzip bundled.append(times gzip compressed)
    times brotli bundled.append(times brotli compressed)
    speed gzip bundled.append(speed gzip compressed)
    speed brotli bundled.append(speed brotli compressed)
    if i != 0 and i % 50 == 0:
        log("logs.txt", "rates_gzip: " + str(np.mean(rates_gzip_bun
dled, axis=0)))
        log("logs.txt", "rates_brotli: " + str(np.mean(rates_brotli
bundled, axis=0)))
        log("logs.txt", "times_gzip: " + str(np.mean(times_gzip_bun
dled, axis=0)))
        log("logs.txt", "times brotli: " + str(np.mean(times brotli
bundled, axis=0)))
        log("logs.txt", "speed_gzip: " + str(np.mean(speed_gzip_bun
dled, axis=0)))
        log("logs.txt", "speed brotli: " + str(np.mean(speed brotli
bundled, axis=0)))
```

Out[408]:

	name	rates	savings	speed(MB/s)
0	gzip 4	3.260182	0.726951	20.650285
1	gzip 5	3.357855	0.736465	17.320770
2	gzip 6	3.392349	0.739789	14.828584
3	gzip 7	3.402581	0.740678	13.650937
4	gzip 8	3.409667	0.741257	11.943546
5	gzip 9	3.410150	0.741290	11.749338
6	brotli 4	3.460357	0.711012	16.654836
7	brotli 5	3.714279	0.730769	11.635901
8	brotli 6	3.745654	0.733024	10.270090
9	brotli 7	3.771763	0.734872	7.601850
10	brotli 8	3.782508	0.735625	5.944935
11	brotli 9	3.793822	0.736414	4.489888
12	brotli 10	4.044363	0.752742	1.181333
13	brotli 11	4.118859	0.757214	0.519743

Unbundled approach

```
In [214]: rates_gzip_unbundled = []
    rates_brotli_unbundled = []
    times_gzip_unbundled = []
    times_brotli_unbundled = []
    speed_gzip_unbundled = []
    speed_brotli_unbundled = []
    init_sizes_unbundled = []
```

```
for i in range(600):
    # write the text of a bundle to file to use it for getting chun
ks from bundle later
   with open("third party/bundle analyzer/text bundle.txt", "w") a
s file:
        file.write(splitted data[i])
    try:
        # save chunks from bundle to parsed bundle.json file
        result = subprocess.run(["node", "--experimental-modules",
"third party/bundle analyzer/get chunks.js"])
    except:
        continue
    # get chunks
    with open("parsed bundle.json") as file:
        codes = [line['code'] for line in json.loads(file.read())]
    sizes gzip compressed = np.zeros(6)
    sizes brotli compressed = np.zeros(8)
    times gzip compressed = np.zeros(6)
    times brotli compressed = np.zeros(8)
    overall init size = 0
    for code in codes:
        if not code:
            continue
        # write the text of a bundle to file to use it for compress
ion later
        with open("example.txt", "w") as file:
            file.write(code)
        overall init size += os.stat("example.txt").st size
        # do the gzip compression with different levels
        for level in range(4, 10):
            result = subprocess.run(["bash", "gzip compress.sh", st
r(level), "time.txt",
                                     "example gzip.txt.gz", "exampl
e.txt"])
            with open("time.txt") as file:
                user sys = file.read().strip().split('\n')[1:]
            time = get seconds(user sys[0].split('\t')[1]) + get se
conds(user sys[1].split('\t')[1])
            sizes_gzip_compressed[level - 4] += os.stat("example gz
ip.txt.gz").st size
            times gzip compressed[level - 4] += time
        # do the brotli compression with different levels
        for level in range(4, 12):
            result = subprocess.run(["bash", "brotli compress.sh",
str(level), "time.txt",
                                     "example brotli.txt.br", "exam
ple.txt"])
            with open("time.txt") as file:
                user sys = file.read().strip().split('\n')[1:]
            time = get seconds(user sys[0].split('\t')[1]) + get se
```

```
conds(user sys[1].split('\t')[1])
            sizes brotli compressed[level - 4] += os.stat("example
brotli.txt.br").st size
            times brotli compressed[level - 4] += time
    rates gzip unbundled.append(overall init size / sizes gzip comp
    rates brotli unbundled.append(overall init size / sizes brotli
compressed)
    times gzip unbundled.append(times gzip compressed)
    times brotli unbundled.append(times brotli compressed)
    speed gzip unbundled.append(overall init size / times gzip comp
ressed)
    speed brotli unbundled.append(overall init size / times brotli
compressed)
    init sizes unbundled.append(overall init size)
    if i != 0 and i % 100 == 0:
        log("logs2.txt", "rates gzip: " + str(np.mean(rates gzip un
bundled, axis=0)))
        log("logs2.txt", "rates brotli: " + str(np.mean(rates brotl
i_unbundled, axis=0)))
        log("logs2.txt", "times_gzip: " + str(np.mean(times_gzip_un
bundled, axis=0)))
        log("logs2.txt", "times_brotli: " + str(np.mean(times brotl
i unbundled, axis=0)))
        log("logs2.txt", "speed gzip: " + str(np.mean(speed gzip un
bundled, axis=0)))
        log("logs2.txt", "speed brotli: " + str(np.mean(speed brotl
i unbundled, axis=0)))
```

```
In [419]: | frame = pd.DataFrame()
          frame["name"] = ["gzip 4", "gzip 5", "gzip 6", "gzip 7", "gzip 8",
          "qzip 9",
                            "brotli 4", "brotli 5", "brotli 6", "brotli 7", "b
          rotli 8", "brotli 9", "brotli 10", "brotli 11"]
          frame["rates bundled"] = np.hstack((np.mean(rates gzip bundled[:600
          ], axis=0),
                                               np.mean(rates brotli bundled[:6
          001, axis=0)))
          frame["savings bundled"] = 1 - 1 / np.hstack((np.mean(rates_gzip_bu
          ndled[:600], axis=0),
                                                         np.mean(rates brotli
          bundled[:600], axis=0)))
          frame["speed bundled(MB/s)"] = np.hstack((np.mean(speed gzip bundle
          d[:600], axis=0),
                                                     np.mean(speed brotli bund
          led[:600], axis=0))) / 1000000
          frame["rates unbundled"] = np.hstack((np.mean(rates gzip unbundled,
          axis=0),
                                                 np.mean(rates brotli unbundle
          d, axis=0)))
          frame["savings unbundled"] = 1 - 1 / np.hstack((np.mean(rates_gzip_
          unbundled, axis=0),
                                                           np.mean(rates brotl
          i unbundled, axis=0)))
          frame["speed unbundled(MB/s)"] = np.hstack((np.mean(speed gzip unbu
          ndled, axis=0),
                                                       np.mean(speed brotli un
          bundled, axis=0))) / 1000000
          frame
```

Out[419]:

	name	rates_bundled	savings_bundled	speed_bundled(MB/s)	rates_unbundled	savings
0	gzip 4	3.352383	0.701705	20.010897	2.714575	
1	gzip 5	3.454900	0.710556	17.201050	2.770296	
2	gzip 6	3.491963	0.713628	14.601151	2.792162	
3	gzip 7	3.502496	0.714489	13.574471	2.798391	
4	gzip 8	3.510398	0.715132	11.716914	2.804235	
5	gzip 9	3.510933	0.715175	11.625863	2.804699	
6	brotli 4	3.565088	0.719502	16.478388	2.903769	
7	brotli 5	3.829246	0.738852	11.519678	3.112397	
8	brotli 6	3.863344	0.741157	10.184582	3.128816	
9	brotli 7	3.892121	0.743071	7.572282	3.145081	
10	brotli 8	3.904304	0.743872	5.926585	3.151561	
11	brotli 9	3.917189	0.744715	4.506134	3.159067	
12	brotli 10	4.177070	0.760598	1.226846	3.335079	
13	brotli 11	4.259316	0.765221	0.539299	3.402424	

Group results by non compressed size ranges

```
In [404]: # ranges are (20000, 100000), (1000000, 1000000), (1000000, 3000000)
          in bytes
          init sizes unbundled = np.array(init_sizes_unbundled)
          group1 = np.where((init sizes unbundled > 2000)*(init sizes unbundl
          ed <= 100000))[0]
          group2 = np.where((init sizes unbundled > 100000)*(init_sizes_unbun
          dled <= 1000000))[0]</pre>
          group3 = np.where((init sizes unbundled > 1000000)*(init sizes unbu
          ndled <= 3000000))[0]
          print(20000, "-", 100000, "bytes")
          frame = pd.DataFrame()
          frame["name"] = ["gzip 4", "gzip 5", "gzip 6", "gzip 7", "gzip 8",
          "gzip 9",
                           "brotli 4", "brotli 5", "brotli 6", "brotli 7", "b
          rotli 8", "brotli 9", "brotli 10", "brotli 11"]
          frame["rates bundled"] = np.hstack((np.mean(np.array(rates gzip bun
          dled)[group1], axis=0),
                                              np.mean(np.array(rates brotli b
          undled)[group1], axis=0)))
          frame["savings_bundled"] = 1 - 1 / np.hstack((np.mean(np.array(rate
          s gzip bundled)[group1], axis=0),
                                                         np.mean(np.array(rate
          s_brotli_bundled)[group1], axis=0)))
          frame["speed bundled(MB/s)"] = np.hstack((np.mean(np.array(speed gz
          ip bundled)[group1], axis=0),
                                                      np.mean(np.array(speed b
          rotli bundled)[group1], axis=0))) / 1000000
          frame["rates unbundled"] = np.hstack((np.mean(np.array(rates gzip u
          nbundled)[group1], axis=0),
                                              np.mean(np.array(rates brotli u
          nbundled)[group1], axis=0)))
          frame["savings unbundled"] = 1 - 1 / np.hstack((np.mean(np.array(ra
          tes gzip unbundled)[group1], axis=0),
                                                         np.mean(np.array(rate
          s brotli unbundled)[group1], axis=0)))
          frame["speed unbundled(MB/s)"] = np.hstack((np.mean(np.array(speed
          gzip unbundled)[group1], axis=0),
                                                      np.mean(np.array(speed b
          rotli unbundled)[group1], axis=0))) / 1000000
          frame
```

20000 - 100000 bytes

Out[404]:

	name	rates_bundled	savings_bundled	speed_bundled(MB/s)	rates_unbundled	savings
0	gzip 4	3.219473	0.689390	19.906293	2.639814	
1	gzip 5	3.316049	0.698436	16.875470	2.688858	
2	gzip 6	3.350974	0.701579	14.277811	2.703293	
3	gzip 7	3.360854	0.702457	13.101073	2.708538	
4	gzip 8	3.367366	0.703032	11.325969	2.713746	
5	gzip 9	3.367827	0.703073	11.248899	2.714211	
6	brotli 4	3.414766	0.707154	16.201073	2.794675	
7	brotli 5	3.663572	0.727042	11.228977	2.989190	
8	brotli 6	3.697175	0.729523	9.944989	3.001100	
9	brotli 7	3.725454	0.731576	7.324780	3.012006	
10	brotli 8	3.738544	0.732516	5.745074	3.015555	
11	brotli 9	3.751895	0.733468	4.353647	3.021005	
12	brotli 10	4.005407	0.750338	1.161323	3.181356	
13	brotli 11	4.081090	0.754967	0.511165	3.238609	

```
In [406]: print(100000, "-", 1000000, "bytes")
          frame = pd.DataFrame()
          frame["name"] = ["gzip 4", "gzip 5", "gzip 6", "gzip 7", "gzip 8",
          "gzip 9",
                           "brotli 4", "brotli 5", "brotli 6", "brotli 7", "b
          rotli 8", "brotli 9", "brotli 10", "brotli 11"]
          frame["rates bundled"] = np.hstack((np.mean(np.array(rates gzip bun
          dled)[group2], axis=0),
                                              np.mean(np.array(rates brotli b
          undled)[group2], axis=0)))
          frame["savings_bundled"] = 1 - 1 / np.hstack((np.mean(np.array(rate
          s gzip bundled)[group2], axis=0),
                                                         np.mean(np.array(rate
          s brotli bundled)[group2], axis=0)))
          frame["speed bundled(MB/s)"] = np.hstack((np.mean(np.array(speed gz
          ip bundled)[group2], axis=0),
                                                      np.mean(np.array(speed b
          rotli bundled)[group2], axis=0))) / 1000000
          frame["rates_unbundled"] = np.hstack((np.mean(np.array(rates_gzip_u
          nbundled)[group2], axis=0),
                                              np.mean(np.array(rates brotli u
          nbundled)[group2], axis=0)))
          frame["savings unbundled"] = 1 - 1 / np.hstack((np.mean(np.array(ra
          tes gzip unbundled)[group2], axis=0),
                                                        np.mean(np.array(rate
          s brotli unbundled)[group2], axis=0)))
          frame["speed unbundled(MB/s)"] = np.hstack((np.mean(np.array(speed
          gzip unbundled)[group2], axis=0),
                                                      np.mean(np.array(speed b
          rotli unbundled)[group2], axis=0))) / 1000000
          frame
```

100000 - 1000000 bytes

Out[406]:

	name	rates_bundled	savings_bundled	speed_bundled(MB/s)	rates_unbundled	savings
0	gzip 4	3.255438	0.692822	21.709783	2.834153	_
1	gzip 5	3.352408	0.701707	18.111059	2.901749	
2	gzip 6	3.385023	0.704581	15.608381	2.937161	
3	gzip 7	3.395387	0.705483	14.415784	2.945246	
4	gzip 8	3.402633	0.706110	12.668371	2.952941	
5	gzip 9	3.403091	0.706150	12.492436	2.953505	
6	brotli 4	3.461648	0.711120	17.202166	3.086969	
7	brotli 5	3.710503	0.730495	11.969930	3.321406	
8	brotli 6	3.740765	0.732675	10.554053	3.346479	
9	brotli 7	3.764571	0.734365	7.812185	3.373016	
10	brotli 8	3.774702	0.735078	6.037380	3.384885	
11	brotli 9	3.785685	0.735847	4.591869	3.396362	
12	brotli 10	4.033893	0.752101	1.202672	3.598985	
13	brotli 11	4.104526	0.756367	0.523913	3.683567	

```
In [407]: print(1000000, "-", 3000000, "bytes")
          frame = pd.DataFrame()
          frame["name"] = ["gzip 4", "gzip 5", "gzip 6", "gzip 7", "gzip 8",
          "gzip 9",
                           "brotli 4", "brotli 5", "brotli 6", "brotli 7", "b
          rotli 8", "brotli 9", "brotli 10", "brotli 11"]
          frame["rates bundled"] = np.hstack((np.mean(np.array(rates gzip bun
          dled)[group3], axis=0),
                                              np.mean(np.array(rates brotli b
          undled)[group3], axis=0)))
          frame["savings_bundled"] = 1 - 1 / np.hstack((np.mean(np.array(rate
          s gzip bundled)[group3], axis=0),
                                                         np.mean(np.array(rate
          s brotli bundled)[group3], axis=0)))
          frame["speed bundled(MB/s)"] = np.hstack((np.mean(np.array(speed gz
          ip bundled)[group3], axis=0),
                                                      np.mean(np.array(speed b
          rotli bundled)[group3], axis=0))) / 1000000
          frame["rates_unbundled"] = np.hstack((np.mean(np.array(rates_gzip_u
          nbundled)[group3], axis=0),
                                              np.mean(np.array(rates brotli u
          nbundled)[group3], axis=0)))
          frame["savings unbundled"] = 1 - 1 / np.hstack((np.mean(np.array(ra
          tes gzip unbundled)[group3], axis=0),
                                                        np.mean(np.array(rate
          s brotli unbundled)[group3], axis=0)))
          frame["speed unbundled(MB/s)"] = np.hstack((np.mean(np.array(speed
          gzip unbundled)[group3], axis=0),
                                                      np.mean(np.array(speed b
          rotli unbundled)[group3], axis=0))) / 1000000
          frame
```

1000000 - 3000000 bytes

Out[407]:

	name	rates_bundled	savings_bundled	speed_bundled(MB/s)	rates_unbundled	savings
0	gzip 4	3.207758	0.688256	22.311194	2.806185	_
1	gzip 5	3.298249	0.696809	19.365311	2.861184	
2	gzip 6	3.327129	0.699441	15.542296	2.875304	
3	gzip 7	3.334811	0.700133	13.912655	2.881370	
4	gzip 8	3.338078	0.700426	12.395455	2.884158	
5	gzip 9	3.338087	0.700427	12.474473	2.884215	
6	brotli 4	3.389592	0.704979	18.884871	2.948077	
7	brotli 5	3.631806	0.724655	12.310412	3.142986	
8	brotli 6	3.662058	0.726929	10.677770	3.153725	
9	brotli 7	3.687079	0.728783	7.824110	3.164575	
10	brotli 8	3.696520	0.729475	5.929425	3.167617	
11	brotli 9	3.705561	0.730135	4.381963	3.171627	
12	brotli 10	3.980056	0.748747	1.136612	3.350162	
13	brotli 11	4.047179	0.752914	0.514281	3.417089	

Compare the results for each example

```
In [389]: ratio of rates = []
          ratio of times = []
          for i in range(len(rates gzip unbundled)):
              ratio of rates.append(np.hstack((np.array(rates gzip bundled[i]
          ) / np.array(rates gzip unbundled[i]),
                                                np.array(rates brotli bundled[
          i]) / np.array(rates brotli unbundled[i]))))
              ratio of times.append(np.hstack((np.array(times gzip bundled[i]
          ) / np.array(times_gzip_unbundled[i]),
                                                np.array(times brotli bundled[
          i]) / np.array(times brotli unbundled[i]))))
          frame = pd.DataFrame()
          frame["name"] = ["gzip 4", "gzip 5", "gzip 6", "gzip 7", "gzip 8",
          "gzip 9",
                            "brotli 4", "brotli 5", "brotli 6", "brotli 7", "b
          rotli 8", "brotli 9", "brotli 10", "brotli 11"]
          frame["ratio of rates"] = np.mean(ratio of rates, axis=0)
          frame["ratio of times"] = np.mean(ratio of times, axis=0)
          frame
```

Out[389]:

	name	ratio of rates	ratio of times
0	gzip 4	1.427097	0.632208
1	gzip 5	1.453109	0.749165
2	gzip 6	1.464445	0.894621
3	gzip 7	1.467382	0.906732
4	gzip 8	1.469844	1.163363
5	gzip 9	1.470023	1.152780
6	brotli 4	1.393734	0.490474
7	brotli 5	1.409129	0.684028
8	brotli 6	1.418572	0.757256
9	brotli 7	1.426384	1.009216
10	brotli 8	1.429969	1.295686
11	brotli 9	1.433369	1.711266
12	brotli 10	1.460546	5.122315
13	brotli 11	1.465019	9.145809