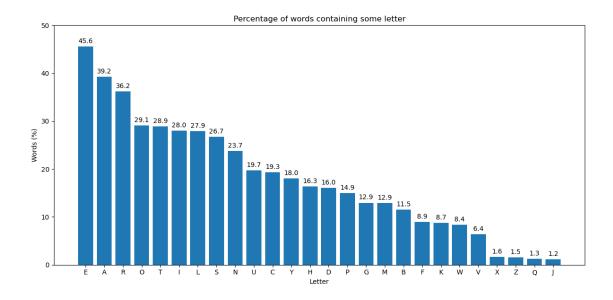
frequency_stats

August 15, 2023

```
[176]: import util
       from matplotlib import pyplot
       import collections, itertools, pathlib, string
[177]: allowed_targets = util.parse_word_list(pathlib.Path('./allowed_targets.txt'))
       allowed_targets = [word.upper() for word in allowed_targets]
       allowed_targets.sort()
       TARGET_LENGTH = len(allowed_targets[0])
       len(allowed_targets), TARGET_LENGTH
[177]: (2309, 5)
[178]: words_with_letter = collections.Counter(
           itertools.chain(*map(set, allowed_targets)))
       sorted_letter_frequencies = words_with_letter.most_common()
       sorted_letter_frequencies
[178]: [('E', 1053),
        ('A', 906),
        ('R', 835),
        ('0', 672),
        ('T', 667),
        ('I', 646),
        ('L', 645),
        ('S', 617),
        ('N', 548),
        ('U', 456),
        ('C', 446),
        ('Y', 416),
        ('H', 377),
        ('D', 370),
```

```
('P', 345),
        ('G', 299),
        ('M', 298),
        ('B', 266),
        ('F', 206),
        ('K', 202),
        ('W', 193),
        ('V', 148),
        ('X', 37),
        ('Z', 35),
        ('Q', 29),
        ('J', 27)]
[179]: pyplot.figure(figsize=(12, 6))
       x = [letter for letter, words in sorted_letter_frequencies]
       y = [
           words / len(allowed_targets) * 100
           for letter, words in sorted_letter_frequencies
       bars = pyplot.bar(x, y)
       for i, bar in enumerate(bars):
           pyplot.annotate(
               f'{y[i]:.1f}', # Format the number with two decimal places
               xy=(bar.get_x() + bar.get_width() / 2, bar.get_height()),
               xytext=(0, 3), # 3 points vertical offset
               textcoords="offset points",
               ha='center',
               va='bottom')
       pyplot.xlabel('Letter')
       pyplot.ylabel('Words (%)')
       pyplot.title('Percentage of words containing some letter')
       pyplot.tight_layout()
       pyplot.ylim(0, 50)
       pyplot.show()
```



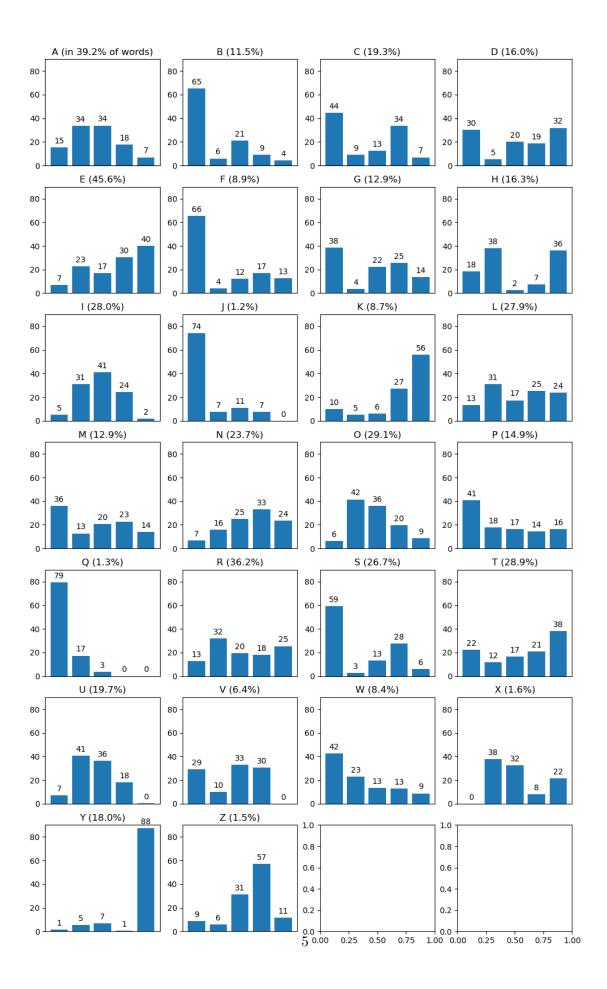
```
[180]: indexed_frequencies = {
    letter: [
        sum(w[i] == letter for w in allowed_targets)
        for i in range(TARGET_LENGTH)
    ]
    for letter in sorted(words_with_letter.keys())
}
indexed_frequencies
[180]: {'A': [140, 304, 306, 162, 63],
```

```
[180]: {'A': [140, 304, 306, 162, 63],
        'B': [173, 16, 56, 24, 11],
        'C': [198, 40, 56, 150, 31],
        'D': [111, 20, 75, 69, 118],
        'E': [72, 241, 177, 318, 422],
        'F': [135, 8, 25, 35, 26],
        'G': [115, 11, 67, 76, 41],
        'H': [69, 144, 9, 28, 137],
        'I': [34, 201, 266, 158, 11],
        'J': [20, 2, 3, 2, 0],
        'K': [20, 10, 12, 55, 113],
        'L': [87, 200, 112, 162, 155],
        'M': [107, 38, 61, 68, 42],
        'N': [37, 87, 137, 182, 130],
        '0': [41, 279, 243, 132, 58],
        'P': [141, 61, 57, 50, 56],
        'Q': [23, 5, 1, 0, 0],
        'R': [105, 267, 163, 150, 212],
```

```
'T': [149, 77, 111, 139, 253],
        'U': [33, 185, 165, 82, 1],
        'V': [43, 15, 49, 45, 0],
        'W': [82, 44, 26, 25, 17],
        'X': [0, 14, 12, 3, 8],
        'Y': [6, 22, 29, 3, 364],
        'Z': [3, 2, 11, 20, 4]}
[181]: figure, axes = pyplot.subplots(7, 4, figsize=(12, 20))
       axes = axes.flatten()
       print('Percent of words having some letter at some position')
       for i, (letter, frequencies) in enumerate(indexed_frequencies.items()):
           ax = axes[i]
           x = list(range(1, 1 + TARGET LENGTH))
           y = [f / words_with_letter[letter] * 100 for f in frequencies]
           bars = ax.bar(x, y)
           for j, bar in enumerate(bars):
               ax.annotate(
                   f'{y[j]:.0f}', # Format the number with two decimal places
                   xy=(bar.get_x() + bar.get_width() / 2, bar.get_height()),
                   xytext=(0, 3), # 3 points vertical offset
                   textcoords="offset points",
                   ha='center',
                   va='bottom')
           if i == 0:
               ax.set_title(
                   f'{letter} (in {words_with_letter[letter] / len(allowed_targets):.
        →1%} of words)'
               )
           else:
               ax.set_title(
                   f'{letter} ({words_with_letter[letter] / len(allowed_targets):.1%})'
               )
           ax.set_xticks([])
           ax.set_ylim(0, 90)
```

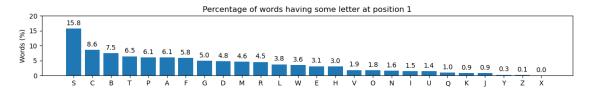
Percent of words having some letter at some position

'S': [365, 16, 80, 171, 36],



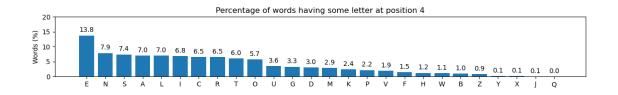
```
[182]: letters_at_index = [
           collections.Counter({
               letter: indexed frequencies[letter][i]
               for letter in words_with_letter
           }).most_common() for i in range(TARGET_LENGTH)
       ]
       for i, c in enumerate(letters_at_index):
           print(i + 1, c)
      1 [('S', 365), ('C', 198), ('B', 173), ('T', 149), ('P', 141), ('A', 140), ('F',
      135), ('G', 115), ('D', 111), ('M', 107), ('R', 105), ('L', 87), ('W', 82),
      ('E', 72), ('H', 69), ('V', 43), ('O', 41), ('N', 37), ('I', 34), ('U', 33),
      ('Q', 23), ('K', 20), ('J', 20), ('Y', 6), ('Z', 3), ('X', 0)]
      2 [('A', 304), ('O', 279), ('R', 267), ('E', 241), ('I', 201), ('L', 200), ('U',
      185), ('H', 144), ('N', 87), ('T', 77), ('P', 61), ('W', 44), ('C', 40), ('M',
      38), ('Y', 22), ('D', 20), ('B', 16), ('S', 16), ('V', 15), ('X', 14), ('G',
      11), ('K', 10), ('F', 8), ('Q', 5), ('Z', 2), ('J', 2)]
      3 [('A', 306), ('I', 266), ('O', 243), ('E', 177), ('U', 165), ('R', 163), ('N',
      137), ('L', 112), ('T', 111), ('S', 80), ('D', 75), ('G', 67), ('M', 61), ('P',
      57), ('B', 56), ('C', 56), ('V', 49), ('Y', 29), ('W', 26), ('F', 25), ('K',
      12), ('X', 12), ('Z', 11), ('H', 9), ('J', 3), ('Q', 1)]
      4 [('E', 318), ('N', 182), ('S', 171), ('A', 162), ('L', 162), ('I', 158), ('C',
      150), ('R', 150), ('T', 139), ('O', 132), ('U', 82), ('G', 76), ('D', 69), ('M',
      68), ('K', 55), ('P', 50), ('V', 45), ('F', 35), ('H', 28), ('W', 25), ('B',
      24), ('Z', 20), ('Y', 3), ('X', 3), ('J', 2), ('Q', 0)]
      5 [('E', 422), ('Y', 364), ('T', 253), ('R', 212), ('L', 155), ('H', 137), ('N',
      130), ('D', 118), ('K', 113), ('A', 63), ('O', 58), ('P', 56), ('M', 42), ('G',
      41), ('S', 36), ('C', 31), ('F', 26), ('W', 17), ('B', 11), ('I', 11), ('X', 8),
      ('Z', 4), ('U', 1), ('V', 0), ('J', 0), ('Q', 0)]
[183]: for i, c in enumerate(letters at index):
           pyplot.figure(figsize=(12, 2))
           x = [letter for letter, words in c]
           y = [words / len(allowed_targets) * 100 for letter, words in c]
           bars = pyplot.bar(x, y)
           for j, bar in enumerate(bars):
               pyplot.annotate(
                   f'{y[j]:.1f}', # Format the number with two decimal places
                   xy=(bar.get_x() + bar.get_width() / 2, bar.get_height()),
                   xytext=(0, 3), # 3 points vertical offset
                   textcoords="offset points",
                   ha='center',
                   va='bottom')
           pyplot.ylabel('Words (%)')
```

pyplot.title(f'Percentage of words having some letter at position {i + 1}')
pyplot.tight_layout()
pyplot.ylim(0, 20)
pyplot.show()











```
[184]: for i, c in enumerate(letters_at_index):
           pyplot.figure(figsize=(12, 2))
           x = [letter for letter, words in sorted(c)]
           y = [words / len(allowed_targets) * 100 for letter, words in sorted(c)]
           bars = pyplot.bar(x, y)
           for j, bar in enumerate(bars):
              pyplot.annotate(
                   f'{y[j]:.1f}', # Format the number with two decimal places
                   xy=(bar.get_x() + bar.get_width() / 2, bar.get_height()),
                   xytext=(0, 3), # 3 points vertical offset
                   textcoords="offset points",
                  ha='center',
                   va='bottom')
           pyplot.ylabel('Words (%)')
           pyplot.title(f'Percentage of words having some letter at position {i + 1}')
           pyplot.tight_layout()
           pyplot.ylim(0, 20)
           pyplot.show()
```

