Define the 5 functions, chosen to match https://en.wikipedia.org/wiki/Beta_distribution#/media/-File:Beta_distribution_pdf.svg . Note that the labeling in this code (a, b, c, d, e) does not coincide with the labeling in Figure 1 (A, B, C, D, E). The correct mapping is given as comments in the code:

```
fa = BetaDistribution[1/2, 1/2] (* A in Fig. 1 *);
fb = BetaDistribution[5, 1] (* E in Fig. 1 *);
fc = BetaDistribution[1, 3] (* B in Fig. 1 *);
fd = BetaDistribution[2, 2] (* D in Fig. 1 *);
fe = BetaDistribution[2, 5] (* C in Fig. 1 *);
```

The following function takes in a sequence of (distribution, multiplier) pairs. It then computes the probability that the largest scaled utility drawn comes from the first given distribution.

```
Integrate [PDF[dist1, x] * CDF[dist2, m1/m2 * x] * CDF[dist3, m1/m3 * x] * CDF[dist4, m1/m4 * x] * CDF[dist5, m1/m5 * x], \{x, 0, 1\}
```

The next function takes in input as above, but computes the expected utility conditional on the agent having the largest scaled utility.

```
In[7]:= condexputil[dist1_, m1_, dist2_, m2_, dist3_, m3_, dist4_, m4_, dist5_, m5_] :=
    Integrate[x * PDF[dist1, x] * CDF[dist2, m1/m2 * x] * CDF[dist3, m1/m3 * x] *
        CDF[dist4, m1/m4 * x] * CDF[dist5, m1/m5 * x], {x, 0, 1}]/
        probmax[dist1, m1, dist2, m2, dist3, m3, dist4, m4, dist5, m5]
```

Multipliers generated in Python to equalize the probabilities:

```
ma = Rationalize[1., 0];
mb = Rationalize[0.8339729309082031, 0];
mc = Rationalize[2.0838546752929688, 0];
md = Rationalize[1.2098731994628906, 0];
me = Rationalize[2.0375137329101562, 0];
```

Using these multipliers, measure how far the probabilities of each agent having the largest scaled utility deviate from the optimal point of 1/5, which is always at most 2*10^-6.

```
\label{eq:normalize} \begin{split} &\text{N[probmax[fa, ma, fb, mb, fc, mc, fd, md, fe, me]} - 1/5, 20] \\ &\text{N[probmax[fb, mb, fa, ma, fc, mc, fd, md, fe, me]} - 1/5, 20] \\ &\text{N[probmax[fc, mc, fb, mb, fa, ma, fd, md, fe, me]} - 1/5, 20] \\ &\text{N[probmax[fd, md, fb, mb, fc, mc, fa, ma, fe, me]} - 1/5, 20] \\ &\text{N[probmax[fe, me, fb, mb, fc, mc, fd, md, fa, ma]} - 1/5, 20] \\ &\text{Out[13]=} \ 1.9926178471538369383 \times 10^{-6} \\ &\text{Out[14]=} \ -1.9075898272784769614 \times 10^{-6} \\ &\text{Out[15]=} \ 2.3870431949109106351 \times 10^{-8} \\ &\text{Out[16]=} \ 1.1530367464121009604 \times 10^{-6} \\ &\text{Out[17]=} \ -1.2619351982365700437 \times 10^{-6} \end{split}
```

Finally, we check the difference between the expected utility of agent i for an item conditioned on i receiving the item and i's expected utility for an item without conditioning. This difference is much smaller for the agent with distribution fb, labeled E in the paper.

```
l_{n[18]}=N[condexputil[fa, ma, fb, mb, fc, mc, fd, md, fe, me] - Expectation[x, x <math>\approx fa], 20]
     N[condexputil[fb, mb, fa, ma, fc, mc, fd, md, fe, me] - Expectation[x, x \approx fb], 20]
     N[condexputil[fc, mc, fb, mb, fa, ma, fd, md, fe, me] - Expectation[x, x \approx fc], 20]
     N[condexputil[fd, md, fb, mb, fc, mc, fa, ma, fe, me] - Expectation[x, x \approx fd], 20]
     N[condexputil[fe, me, fb, mb, fc, mc, fd, md, fa, ma] - Expectation[x, x \approx fe], 20]
```

Out[18]= **0.41627014764957458444**

Out[19]= 0.064716892528258072566

Out[20]= 0.29611394460090903177

 $Out[21] = \ \textbf{0.26294068032548731606}$

 ${\sf Out[22]=}\ \ \textbf{0.22236473132350756367}$