# **Amazon Reviews**

### How are Amazon reviews used?

Common scenario: want a a type of product (e.g. coffee grinder), but don't know any brands or models

Search for "coffee grinder", sort by "Avg. Customer review" or "Relevance"

Pick an item that: fits your price range, ~4.5 stars, > 30 reviews

Scroll down to "Most Helpful Customer Reviews", read one or two

Buy product

### How are Amazon reviews used?

This approach has a heavy reliance on user submitted reviews, specifically their aggregate score and helpfulness score.

Is it a good idea to rely on the user submitted reviews?

### Maybe not



SUPPLEMENTS comments related

other discussions (1)

analyzed all 580 reviews on the top selling "Natural Testosterone Booster" supplement on Amazon. Pretty much all of them were bogus. (self.Supplements) submitted 1 month ago by flexpex



3 weeks ago, I posted a study I did on reviews on manufacturer's websites. The #1 comment on that thread mentioned:

This is why you can also buy supplements from amazon, where negative reviews are mostly not removed, whereas suspicious positive reviews are removed. So the reviews are a "bit more" trustworthy.

I wanted to see just how much a "bit more" was, so spent several hours reading through and analyzing all 580 reviews on the #1 selling Natural Test Booster.

I found countless examples of reviewer fraud, including many reviewers stating they hadn't used the product, many reviewers who didn't even mention the product, even one user stole a before/after picture from r/progresspics and uploaded it as their own.

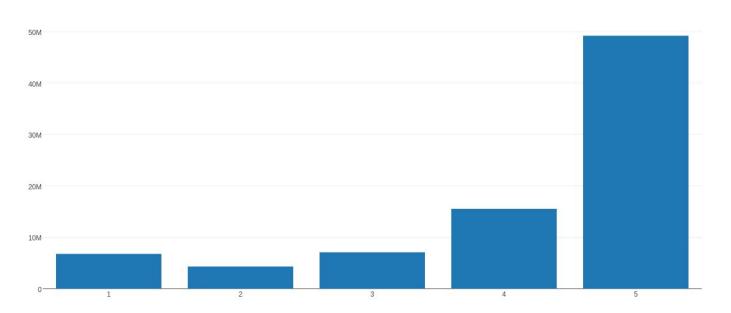
Less than 10% of the reviewers were "verified purchasers", and most of the review histories I checked showed that they were only rating products from the same brand, and they were giving them all 5 stars.

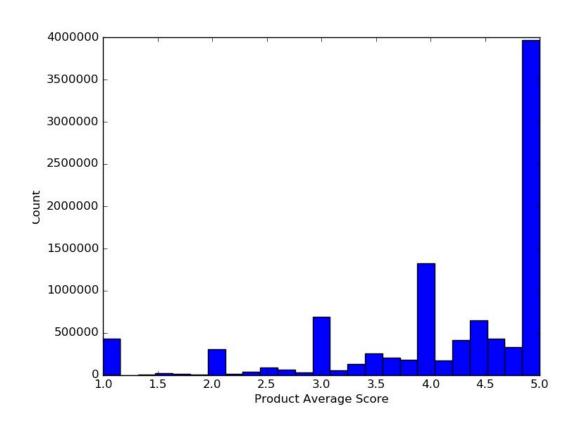
Basically, the reviews looked even worse than I thought they would, with essentially no signs of honest, thorough or detailed reviews whatsoever.

You can read the full study here (warning: long)

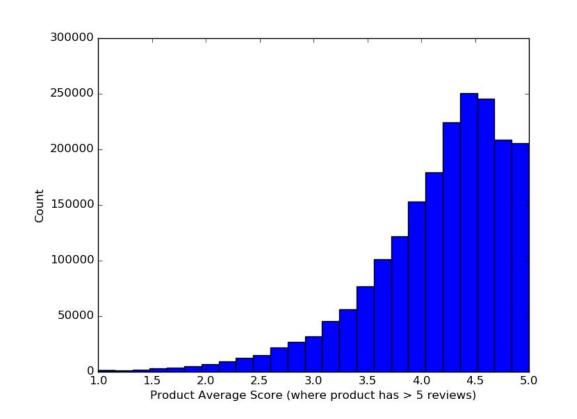
### Review score distribution





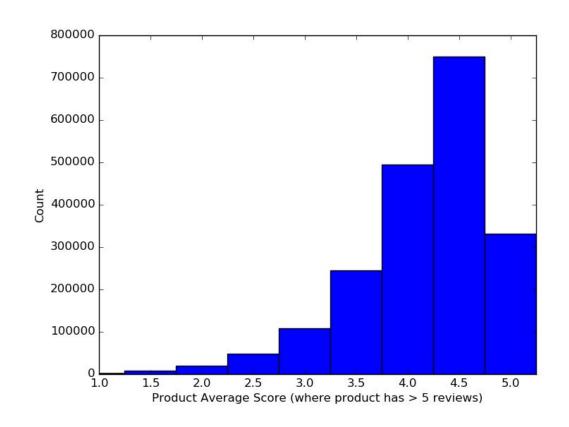


Something is wrong



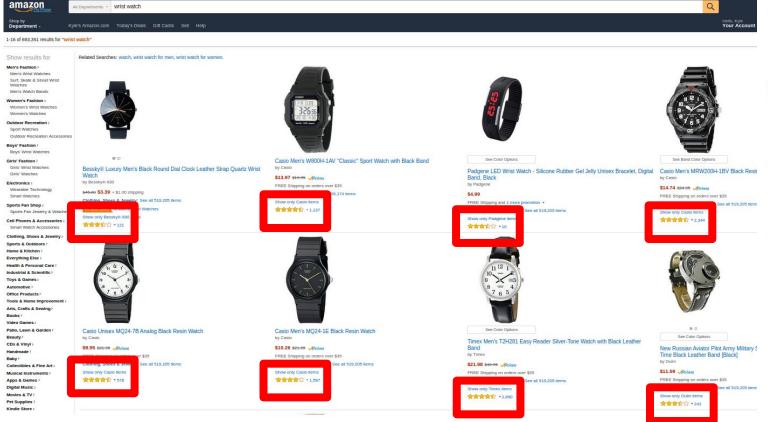
Look at products with > 5 reviews

Peak bin ~4.3



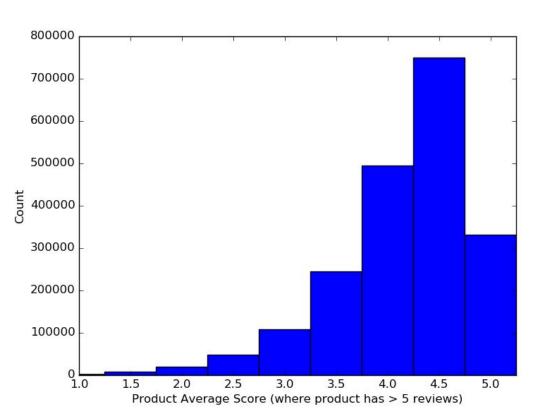
Let's change the bucket width Why did I pick these numbers?

### Why these buckets?



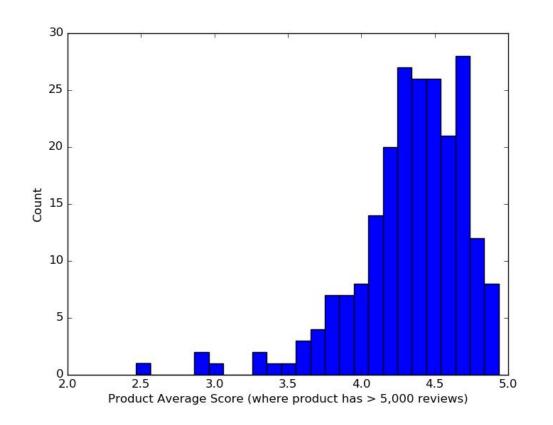
### The UI!





Range	Stars	Count	Percent
1.00-1.24	1.0	1831	0.09%
1.25-1.74	1.5	7702	0.38%
1.75-2.24	2.0	19894	0.99%
2.25-2.74	2.5	48707	2.43%
2.75-3.24	3.0	107941	5.37%
3.25-3.74	3.5	245643	12.23%
3.75-4.24	4.0	495257	24.65%
4.25-4.74	4.5	750529	37.36%
4.75-5.00	5.0	331302	16.49%

## Product aggregate scores (aside)



For fun let's look at items with over 5,000 reviews

Kind of similar, but who's on top?

Who's that one at 2.5?

### HELP!

### But Amazon has a helpfulness measure that it uses to highlight reviews!

#### Most helpful customer reviews

\*\*\* Nice Weight, Nice Looks, Perfect Fit!

By rtrifts on Sept. 5 2015

#### Verified Purchase

This is cheap, nice weight, double ended to fit either size of a normal filter cup and I was pleasantly surprised. For \$5, this a great gadget which does exactly what you think it will and looks and feels great while doing it. It's much better than the plastic tamper that game with my Gaggia. Buy with confidence.

Was this review helpful to you? Yes No Report abuse

1 of 1 people found the following review helpful

#### ★★★★★ Sturdy.

By JESUS CASTRO on Nov. 17 2014

#### Verified Purchase

It does exactly what it is supposed to. High quality. Sturdy.

Was this review helpful to you? Yes No Report abuse

1 of 1 people found the following review helpful

#### \*\* \* \* Very happy with this.

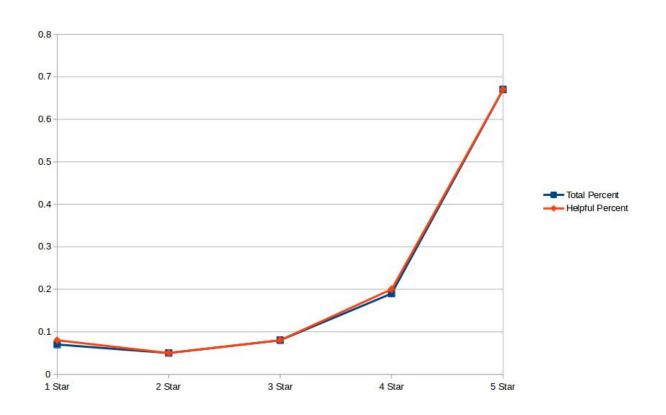
By Anne TOP 1000 REVIEWER On March 11 2015

#### Verified Purchase

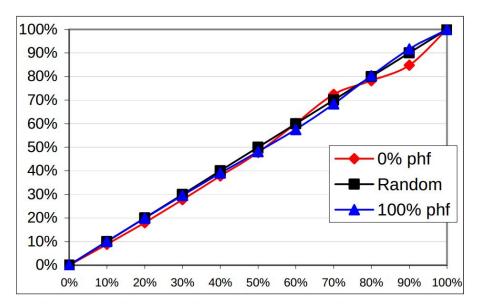
Very good as it has two sizes and nice weight. Great price.

Wasting in belief to a Real No. Barrella

## "Helpfulness"



### "Helpfulness" continued



**Figure 10**: Lift curves for reviews with 0 and 100% positive feedbacks with minimum of 1 feedback.

Bing Liu has written several papers on spam in amazon reviews

Reviews with 100% positive helpful reviews were just as much spam as reviews with 0% helpful reviews

Figure from Nitin Jindal and Bing Liu. "Opinion Spam and Analysis." Proceedings of First ACM International Conference on Web Search and Data Mining (WSDM-2008), Feb 11-12, 2008, Stanford University, Stanford, California, USA.

### Is it spam?

Is spam causing this intense positive skew?

"Opinion Spam and Analysis" (Jindal, et al. 2008) created a model that could identify spam in amazon reviews ~80% of the time.

They found ~1% of reviews could be considered spam.

## Is it spam?

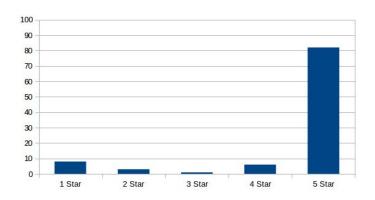
Remember our Histogram:

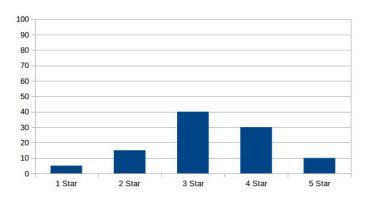
1% will have almost no effect

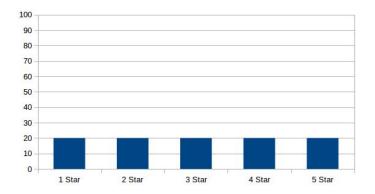
Need something else

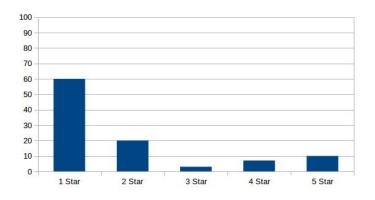


## Who do you trust?









### Alternate: A-Scores

Give each reviewer a score based on their review history

Use reviewers score as a weight when calculating mean score of products -> Investigate how products scores change with this approach

Use A-Score to decide what reviews to highlight for a product

## Calculating A-Scores

## What changed

## What changed

## What changed

### Can I use this?

Yes!

### The Dataset