# Visual Item Analysis

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This document discusses graphics-based methods for assessing the quality of cognitive test items. It suggests that Lertap's quintile plots may serve as an effective visual alternative to the many tables commonly found in Lertap output, permitting item effectiveness to be determined by eye. The document also suggests that "non-standard" quintile plots may be used to visually detect group differences in item response patterns.

### **Quintile plots**

Quintile plots are Excel charts created from the information found in the "Statsul" reports created by Lertap; such plots will play a big role in this paper. Here's an example of the output found in a typical Statsul report:

Options->	1	2	3	4	5	other	U-L diff.	U-L disc.
A27mc Grp1	0.00	0.00	0.00	0.95	0.05	0.00	0.56	0.77
A27mc Grp2	0.04	0.02	0.05	0.70	0.19	0.00		
A27mc Grp3	0.02	0.12	0.10	0.47	0.27	0.03		
A27mc Grp4	0.09	0.12	0.07	0.26	0.46	0.00		
A27mc Grp5	0.19	0.12	0.09	0.18	0.37	0.05		

The table above provides data for one item, in this case item "A27mc $^1$ ". The item used five options, with corresponding <u>response codes</u> of Res=(1,2,3,4,5). The correct answer to this item was 4, signified by the underlining seen in the column under the 4. Note that the response codes are called "Options" in the table.

The results in the table have been broken out by five groups: "Grp1", "Grp2", "Grp3", "Grp4", and "Grp5". These groups were formed by having Excel sort the distribution of test scores into five levels ("quintiles"): the highest 20% (Grp1), the 2nd-highest 20%, the 3rd-highest 20%, the 4th-highest 20%, and the lowest 20% (Grp5). The "other" column indicates the proportion of students in each quintile who did not answer the item.

The Statsul table above reports that the proportion of students in Grp1 who were able to identify the correct answer was 0.95, or 95%. Note how this proportion drops as we go down the correct answer column: it goes from 0.95, to 0.70, to 0.47, to 0.26, and then, in Grp5, the lowest group, to 0.18. Fewer than 20% of the students in the weakest group were able to pick out the correct answer to item A27mc. The report also indicates that option 5, an incorrect answer, a "distractor", was popular with the two lowest groups. It was also selected by 27% of the middle group, by 19% of the 2nd highest group, and even by 5% of the top students, those in Grp1.

The end of a Statsul report has a descriptive summary of the five groups, as seen below:

<sup>&</sup>lt;sup>1</sup> "A27mc" indicates that item A27 was a multiple-choice item used in Form A of the test. This test also had some short-answer items, and there was an equivalent test form, Form B. (Reference.)

Summary group statistics								
	<u>n</u>	<u>n(%)</u>	<u>avg.</u>	avg%	<u>s.d.</u>	<u>min.</u>	<u>mdn.</u>	max.
Grp1	57	19.79%	32.8	66%	2.9	29	32	40
Grp2	57	19.79%	26.4	53%	1.4	24	26	29
Grp3	60	20.83%	21.5	43%	1.3	19	22	24
Grp4	57	19.79%	17.0	34%	1.1	15	17	19
Grp5	57	19.79%	11.9	24%	2.8	5	13	15
everyone	288		21.9	44%	7.5	5	22	40

The "Summary group statistics" indicate: "n", the number of students in a group; "n%" is "n" expressed as a percentage of the total number of students; "avg." the average test score for a group; "avg.%", avg. expressed as a percentage of the maximum possible score; "s.d.", the standard deviation of a group's test scores; "min.", the lowest score found in a group; "mdn.", the median of the test scores found in each group; and "max.", the highest score found in each group.

Item analysis involves a process of determining how well test items meet the objectives they have been designed for. Tests are often meant to help us identify the "best" students, those whose knowledge of relevant subject matter is strong, above average. Items which assist in this process are said to be ones which can "discriminate" the strong students from the weak ones.

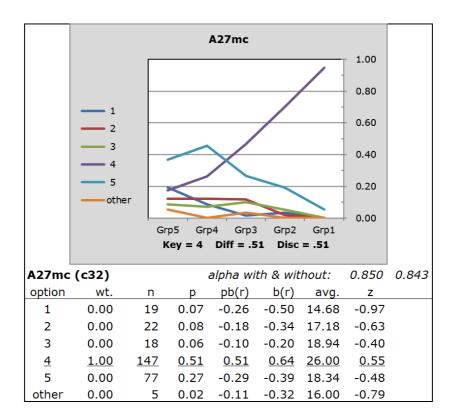
Traditional item analysis has been based on a study of numeric summaries of results. If an item is discriminating, only the top students will get it right; the other students will be drawn off by the distractors. Item A27mc would seem to be a good item: the proportion of students who correctly answered the item was greater the higher the group. Conversely, the proportion of students who selected the distractors was highest in the lowest groups.

Lertap provides several numeric summaries of results. They're found in the Statsul report exemplified above, and in two other report formats which will be mentioned later, Stats1f and Stats1b.

In this paper we'll look at an alternative way to go about determining whether or not an item has discriminated – we'll use graphs referred to as "quintile plots". Such plots can very effectively portray how well items have discriminated.

Quintile plots are made from the proportions shown in the very first table above, from a <u>Statsul</u> report. (This <u>paper</u> might be a useful reference.)

The "standard" Lertap quintile plot for item A27mc is shown below. The statistics seen at the base of the plot are from the <u>Stats1f</u> report created by Lertap. In the plot seen below, Lertap's <u>option</u> to remove line markers has been used.



How many lines are included in this graph? Six: see the legend to the left of the plot. There's one line for each item option, 1 to 5, and a sixth line, "other", corresponding to students who did not answer the item.

The purpose of Lertap's standard quintile plot is to graphically trace the performance of each item option and, in so doing, allow us to visually assess the quality of the item in terms of its ability to help us discriminate strong students from weaker ones.

A cognitive item meant to identify the best students, those whose mastery of test content is strong, will have a plot similar to the one above for item A27mc. There will be one line, that corresponding to the right answer, which steadily rises from left to right across the plot.

For item A27mc, the correct answer was 4. Look carefully at the trace of the correct answer's proportions<sup>2</sup>: we start with 18% in the weakest group, Grp5, increase to 26% in the next-lowest group, the "4th" group; go up to 47% in the middle group; to 70% in the 2nd-best group; and then, in GRP1, the top group, hit 95%. (*Note*: an option is available to quickly display these group response proportions when wanted. It's the "Data table toggle". Read about it here.)

A discriminating item will have trace lines for the wrong answers, the distractors, which drop, which dip down, as we go from left to right. The purpose of the distractors is to pose item answers which will seem quite plausible to weaker students, but not to the top students. Effective distractors are an absolute must for discriminating items; if they do not appear as reasonably possible answers to some, almost everyone will get the item right, thwarting our effort to identify the most capable students.

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<sup>&</sup>lt;sup>2</sup> The purple line in the plot, the line that rises rapidly from left to right.

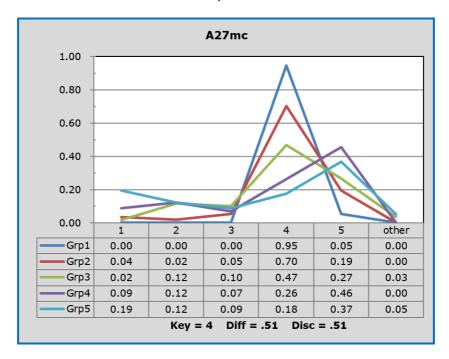
Item A27mc has one distractor which worked particularly well: 5. This distractor was selected by 37% of the lower group (Grp5), and by almost half, 46%, of the next-lowest group, the 4th group. As we go from left to right across the plot we find a pattern: the popularity of distractor 5 falls off, dropping to 5% for the top group (Grp1). This is what we expect of well-performing distractors: they will seem plausible only to those whose content mastery is weak – most if not all of the top students will recognise distractors as being incorrect.

Quintile plots can take the place of Lertap's various reports, at least to a certain extent. Once you've got the hang of them, it's possible to pick out poorly-functioning items by scrolling down the graphs, looking for items which don't display the desired pattern. The easiest give-away is simple: look for plots which do not have one line rising rapidly from left to right; these are likely to be the items most in need of attention.

# The non-standard quintile plot in Lertap

The quintile plots pictured above have been referred to as "standard" ones. This is because Lertap has a second quintile plot, one where the x-axis corresponds to item options instead of quintile groups. This version of the plot is called the <a href="mailto:non-standard version">non-standard version</a>, the "Chtb" version, or simply the "b" version.

Here's item A27mc in a "non-standard" plot:



The lines in this "non-standard" plot now trace the five groups over each of the item options. In the "standard" plot, the lines traced the options over each of the five groups – here, in this plot, we have simply swapped things around.

Non-standard quintile plots provide the means to examine what is referred to as "distractor functioning".

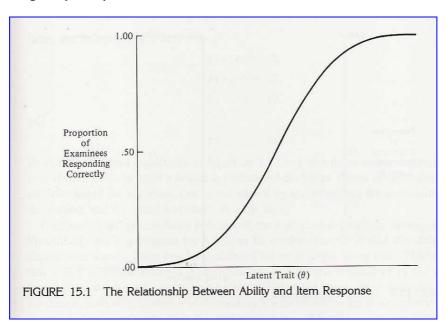
Let's review what we expect of a "good" cognitive item: its correct answer will be identified by the strongest students; the distractors will be selected by the weaker students. Thus, we would expect the response trace lines for the top two

groups to be below the other lines for each distractor, and above them for the right answer.

In the table below the plot immediately above, scan down the column for 4, the correct answer to item A27mc. The proportion of students selecting the correct answer declines as we go down the column, from 0.95 to 0.18, from the strongest quintile (Grp1) to the weakest (Grp5).

Then pick out one of the distractors, such as 5, and scan down the corresponding column. If all works as wanted, the proportion selecting this distractor will <u>increase</u> as we go down the column (and this is almost the case for A27mc).

#### Standard versus non-standard



The y-axis of the ICC, the vertical axis, is the same as that found in Lertap's quintile plots. The abscissa, on the other hand, the x-axis, is similar but not identical. The ICC abscissa refers to a "latent trait" of the people tested; du Toit (2003, p.832) writes "In much of the IRT literature, this latent variable is referred to as 'ability', but in an educational context a more apposite term is 'proficiency'". (Note that the ICC does not concern itself with distractors, only with correct answers; Figure 15.1 indicates that the proportion of test takers getting the item correct steadily increases in accordance with their latent ability.)

The x-axis seen in Lertap's "standard" quintile plot is usually based on the scores of those tested. If we take these scores as being related to "ability", then the standard quintile is plotting over something similar to the ICC. Of course, the ICC uses a continuous x-axis whereas Lertap's x-axis is usually based on just five grouped levels of test scores<sup>3</sup>.

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<sup>&</sup>lt;sup>3</sup> It is possible to have Lertap's plots work with up to 10 "grouped levels". See this topic.

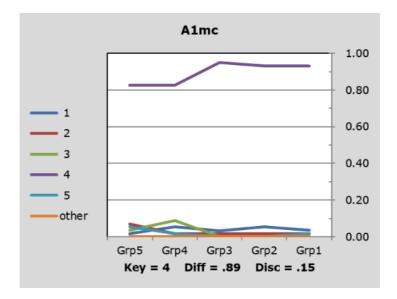
Lertap's standard quintile plot is essentially identical to the item trace lines seen in Wainer (1989), although Wainer's x-axis, like that of the ICC, is continuous, i.e., not broken into the five grouped levels of test scores seen in Lertap's plots.

We might conclude, then, that the "standard" quintile plot is more aligned to the types of item response information displays found in the literature.

Notes: it is possible to have plots which trace only the correct answer; see <u>this</u> <u>topic</u>. Lertap has support for IRT; refer to <u>this topic</u>.

### Sample quintile plots

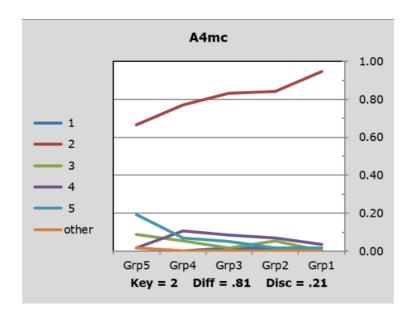
A look at sample standard quintile plots may be useful. Most of the plots below are taken from items belonging to a professionally-developed aptitude test for high school students. The test had 70 items<sup>4</sup>. Fifty (50) of the items were five-option multiple-choice questions, using response codes of  $\{1,2,3,4,5\}$ . The remaining twenty items were short-answer questions.



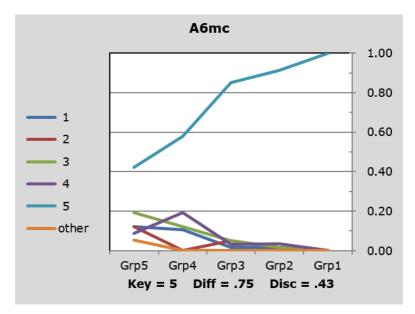
This item, A1mc, reflects the pattern found for easy test items. The item is not discriminating well at all; the proportion of people able to find the correct answer is high even in the lowest groups; the four distractors are apparently not seen as plausible answers by more than 10% of the test takers in any of the five groups. This was the first item in the test, and it was intentionally designed to be easy.

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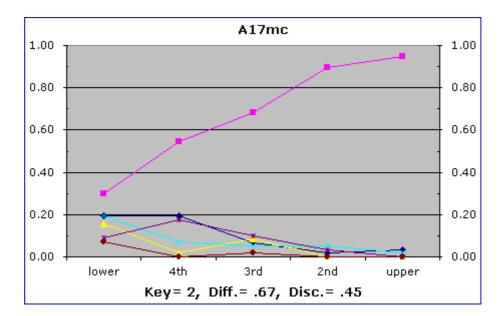
<sup>&</sup>lt;sup>4</sup> Item A27mc was one of the items.



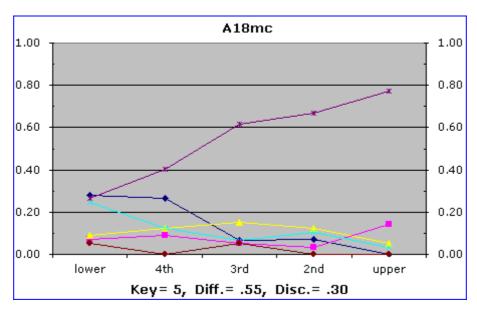
Item A4mc is also easy, but not quite as easy as A1mc. Here we're starting to see the pattern desired of a discriminating item: the trace for the right answer dips on the left, and then steadily rises. The trace lines for the distractors are highest on the left, dipping down to the right.



The desired pattern continues to develop here. Item A6mc would still be considered to be easy, but it is a better discriminator: the left-end dip for the correct answer is more pronounced, the distractors are appealing to a higher proportion of people in the lowest groups, but the top students are able to rule out each of them (the distractors). We could say that the distractors "zero-out" as their trace lines completely dip to touch the x-axis on the right.

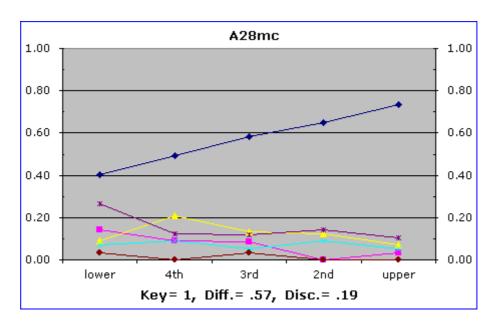


Item A17mc's pattern<sup>5</sup> is strong on the left, where the trace of the correct response falls more than that seen in item A6mc. This is a good pattern, but it's not quite as strong on the right as is A6mc. A17mc's distractors dip down at the right end, as we want – however, they don't dip to zero; one or two of the distractors still appear plausible to a small proportion of students in the best group.

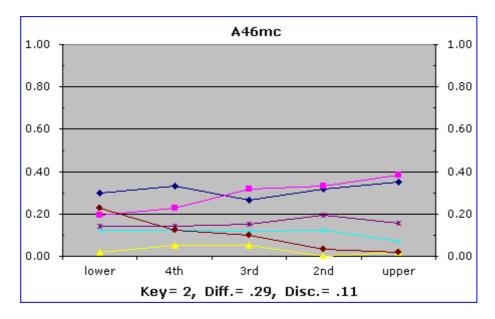


Item A18mc shows a big left-end dip for the right answer, but the distractors don't fall off as much as we'd like. Still, this would be considered to be a good item if we use the classical item quality measures found in the literature: a difficulty in the range 0.40 to 0.60, and a discrimination of at least 0.30 (see Chapter 7 of the Lertap manual, Nelson (2000), for more discussion).

<sup>&</sup>lt;sup>5</sup> This and the following plots were created by an earlier version of Lertap.

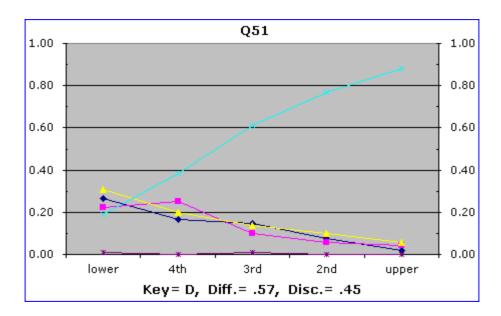


The steady rise shown by A28mc's right answer looks good, but this item's distractors do not fall off sharply; about a quarter of the students in the upper group, approximately 25%, have been attracted to what are supposed to be distractors, options intended to seem plausible only to the less proficient students.



Item A46mc shows a poor pattern. The right answer (pink line) rises from left to right to be the highest point for the upper group, but the rise is very slow, hardly compelling. Just over 60% of the students in the upper group were distracted by one of the incorrect answers, and the distractors do not fall off as we move from left to right. In fact, one of the distractors actually climbs a wee bit.

Let's end these sample shots with a nicely-functioning item from another test, one with four-option items, with {A,B,C,D} used as response codes:



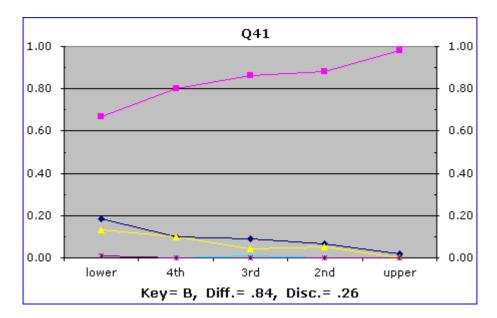
Q51 exhibits a near ideal pattern for a discriminating question. The trace for the correct answer (light blue line) rises sharply. The distractors all taper off steadily. Although they don't quite zero out, two of the three distractors fall off in an almost linear manner, coming close to being straight lines. The students in the lower group seem to have been at a complete loss on Q51 – each of the three distractors was selected by more than 20% of this group.

So then, let's see. We've looked at how many plots? Eight. What do you think? Is it easier to assess item quality by using graphs, or by using tables with numbers? The plots are kind of catching, are they not?

#### The Statsb and Statsf reports

The quintile plots are based on Lertap's Statsul report, as mentioned above. Lertap produces two other reports for cognitive items, <u>Statsb and Statsf</u>. The letters at the end of the report names mean "upper-lower", "brief", and "full", respectively.

Something which the quintiles may be somewhat poor at is pointing to distractors which have completely failed in their task, that is, distractors which have not appeared as plausible to anyone. Have a look at the following plot:



The item plotted above, Q41, had three distractors. One of them was not selected at all. Its line lies flat along the x-axis, and is very hard to detect.

Such distractors are unwanted. In a test meant to discriminate among students, picking out the strongest from the weakest, items with non-functioning distractors need fixing. A "dead" distractor, one obviously incorrect even to weak students, increases the chances that the less knowledgeable students may get an item correct without knowing the underlying concept or fact.

Lertap's Statsb report is made to help detect poorly-functioning distractors. Here's a sample from a Statsb report:

Lertap5 brief item stats for "Form A MC", created: 16/05/2006.									
Res =	1	2	3	4	5	other	diff.	disc.	?
A18mc	14%	8%	11%	11%	55%	2%	0.55	0.30	2
A21mc	26%	56%	8%	2%	8%	1%	0.56	0.26	
A22mc	_55%_	8%	6%	24%	6%	2%	0.55	0.39	
A23mc	19%	11%	8%	16%	44%	2%	0.44	0.46	
A24mc	12%	50%	8%	9%	17%	5%	0.50	0.43	
A26mc	16%	4%	15%	49%	11%	5%	0.49	0.27	1

The last column of the Statsb report, the one with the ? mark heading, will point out distractors which have not been seen as plausible by any of the test takers, and/or have appeared as plausible to strong students.

In this example, item A18mc has distractor 2 noted in the ? column. Looking to the left in the same row, we see that 8% of the students selected this distractor, so it's not really a "dead" distractor (one not selected by anyone). What has happened in this case is that the students who selected option 2 were above-average students.

If you look above item A18mc's quintile plot is displayed (page 8). You can see distractor 2 sticking up on the right, attracting about 18% of the students in the strongest group. As we trace this distractor's performance across the graph, from left to right, we see that it was most popular with the highest group.

This is a curious result. It has served to bring down the item's discrimination index, "Disc". Item A18mc could very well be a better item if we could find out what it was that prompted almost one in five of the strongest students to select this distractor, something we might do by talking to the students taking the test.

Lertap has another report with item statistics; here's a snippet:

Lertap	5 full ite	m stats fo	or "Form .	А МС", с	reated: 1	16/05/200	6.	
A18m	C							
	option	wt.	n	р	pb(r)	b(r)	avg.	z
	1	0.00	39	0.14	-0.34	-0.53	15.51	-0.86
	2	0.00	22	0.08	0.05	0.10	23.32	0.19
	3	0.00	31	0.11	-0.03	-0.05	21.32	-0.08
	4	0.00	33	0.11	-0.16	-0.26	18.61	-0.44
	<u>5</u>	1.00	<u>157</u>	<u>0.55</u>	<u>0.30</u>	<u>0.37</u>	<u>24.34</u>	<u>0.32</u>
	other	0.00	6	0.02	-0.11	-0.32	16.17	-0.77

The table above is from a <u>Statsf report</u>. Not everyone likes to look at this report as it involves so many statistics; a fair proportion of Lertap users often cannot recall what pb(r) and b(r) are, even though they fondly re-read their favourite chapters in the <u>Lertap manual</u> several times a week.

Not to worry; the matter worthy of note is the "avg." value of 23.32 for the 22 students who selected option 2. This is their average test score, and it's high, almost as high as the average of 24.34 for the 157 students who selected the right answer (option 5).

For this test, the overall average score, for all 288 students, was 21.92, a value found in the Scores report:

Lertap5 Scores worksh					
Record No.	FA-MC				
n	288				
Min	5.00				
Median	21.50				
Mean	21.92				
Max	40.00				
s.d.	7.48				
var.	55.90				
Range	35.00				
IQRange	11.00				
Skewness	0.14				
Kurtosis	-0.61				
MinPos	0.00				
MaxPos	50.00				
▶ N Scores Stats1f Stats					

As a z-score, the average of 23.32 for the 22 students selecting item A18mc's option 2 was (23.32 – 21.92)/7.48, or 0.19. This, a z-score quite above zero for a distractor, is just another reflection of what we can see in the item's quintile

plot: some of the strongest students thought this was the correct answer to the item. This is an unwanted outcome; when it happens we usually suspect there may be some ambiguity in the item – something that ought to be fixed.

#### Recapping

To review, we started this discussion by looking at a Statsul report, and the quintile plots which graphically portray the information contained in the report.

Quintile plots are undoubtedly neat. With some practice they can be used to quickly get an idea of how test items are functioning. However, they're not perfect – if a distractor is "dead", not distracting anyone, its plot line will lie flat along the x-axis, and may be very difficult to detect.

The Statsb report provides a more concise indication of how distractors have functioned. A scan down the last Statsb column will immediately reveal items whose distractors may require some attention.

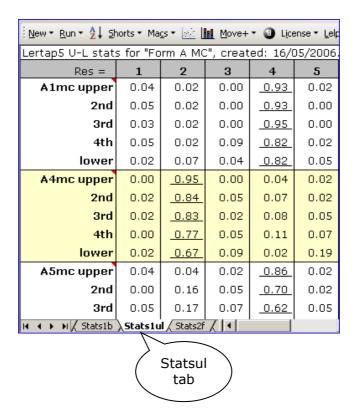
There's much more about how to use and interpret the Statsul, Statsb, and Statsf reports in the manual (Nelson, 2000). (Web version is here.)

### How to get quintile plots

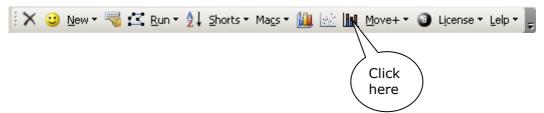
For those readers who have not used quintile plots before, it will be a good idea to mention the steps required to make them.

Once data have been prepared, and CCs control lines made, a click on Lertap's Run menu's "Interpret CCs lines" option, followed by a click on the Run menu's "Elmillon item analysis", will result in the Statsf, Statsb, and Statsul reports.

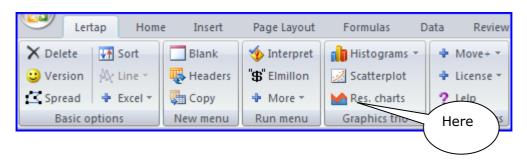
To get quintile plots, open the Statsul report by clicking on its tab, as pictured below:



Next, go up to the Lertap toolbar<sup>6</sup>, and click on the icon to the left of the <u>M</u>ove+menu (note: the toolbar shown here was used with older versions of Excel).



If your computer is using Excel 2007 (or later), click on the Res. Charts icon:



You should find Lertap making the quintiles.

### **Quintile plot options**

There are a few options which pertain to how and when Lertap makes its quintile plots. For example, you don't have to have five score groups: you may have as few as two. You can have Lertap output non-standard quintiles instead of standard ones. Having a table appended to each plot is another option. Read all about the options in "Lelp", Lertap help.

#### Quintile plots and item statistics

Have you been looking at the Diff. and Disc. values which appear below the x-axis in Lertap's quintile plots? These statistics have intentionally been excluded from the discussion above – we've wanted to stand back and look at the gestalt, at the whole picture, without having to get down to the nitty-gritty of statistics.

But there are some interesting observations to make.

"Diff." is item difficulty; it's the proportion of people who correctly answered an item. The higher item Diff. is, the higher the proportion of people getting the item right, the easier the item. (Diff. is actually a <u>great</u> misnomer; the untrained would expect high Diff. to mean high difficulty, but the opposite is true.)

Study the graphs again, looking at the pattern reflected by the trace lines, and at "Diff.". Higher Diff. values (easy items) might seem to be associated with two characteristics of the plots: a relatively flat trace for the correct answer, with no sharp left-end dip.

Is this not the general case?

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<sup>&</sup>lt;sup>6</sup> The "toolbar" refers to quite early versions of Excel, before Excel 2007.

No, it's not. Look at item A46mc. The correct answer's trace starts at 0.20, rising to just under 0.40 at the right. Not much of a rise, a fairly flat trace. There's no left-end dip to speak of. But this is a low-Diff. item (hard).

There's a third characteristic of high-Diff. items: their correct-answer trace starts high, and continues so across the plot. This being the situation, let's say this: an item will have high Diff. (be easy) if the trace line for the correct answer is high on the left, and stays high, maybe even rising a bit as we move to the right.

Such a line will not have much slope. Slope? The slope of a line is an index of how unflat it is, to put it in unglorious terms. A flat line has no slope. A line with a slope of 1 (one) will rise at about a 45-degree angle from left to right.

A high-Diff. item, an easy item, is one whose correct-answer trace starts high on the left, and is fairly flat, having little slope.

With regard to the item discrimination index displayed at the bottom of the plots, "Disc.", what pattern is seen in the plots?

The greater the slope for the correct option's trace line, the greater Disc.

Is this right? Let's see. Let's approximate the slope of the correct answer's trace by subtracting the proportion for the lower group from the proportion for the upper group.

Here's a little list, including respective Disc. values.

```
For Almc we'd have 0.96 - 0.81, or 0.15. Disc. = 0.15.

For A46mc we'd have 0.38 - 0.20, or 0.18. Disc. = 0.11.

For A4mc we'd have 0.98 - 0.67, or 0.31. Disc. = 0.21.

For A28mc we'd have 0.73 - 0.40, or 0.33. Disc. = 0.19.

For A18mc we'd have 0.78 - 0.27, or 0.51. Disc. = 0.30.

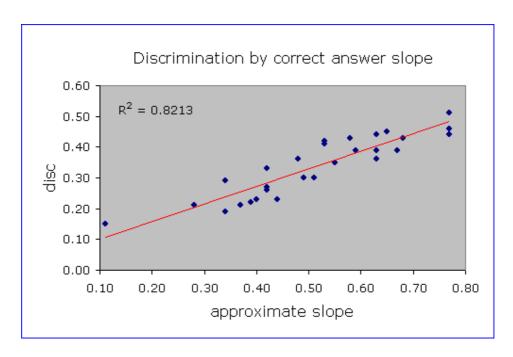
For A6mc we'd have 1.00 - 0.41, or 0.59. Disc. = 0.43.

For A17mc we'd have 0.97 - 0.30, or 0.67. Disc. = 0.45.
```

Is there not a pattern? As the approximation of slope increases, the Disc. values tend to increase.

A scatterplot of the approximate slope index by Disc. value for the first thirty multiple-choice items in the aptitude test is shown below<sup>7</sup>; the line superimposed on the plot is a "regression line", a "trend line", which lets us see the general drift of the relationship between Disc. and approximate slope:

 $<sup>^{7}</sup>$  Only the first 30 items were studied as this was a "speeded test"; there was insufficient time for many of the students to work beyond the 30th item.



There is a relationship, at least for the selected items: higher Disc. values are associated with higher slope estimates.

The greater the slope for the correct answer's trace line, that is, the higher the Disc. value, the better the item is discriminating.

This is only to be expected. The Disc. statistic seen in Lertap is a <u>point-biserial correlation</u> coefficient formed by correlating student test scores with a select / not-select index for the correct answer. If a student selected the correct answer, we could give him/her a select / not-select "score" of 1 (one); if s/he did not select the correct answer, we could give a select / not-select score of 0 (zero). We'd then correlate the select / not-select scores with test scores.

Higher correlations will result when those selecting the correct answer have the highest test scores. In terms of a standard Lertap quintile plot, those with highest test scores are in the "upper" group (Grp1). The number in this group with a 1 on the select / not-select index can be found by multiplying group n by group proportion; call this n(high). At the other end, the left end of the plot, we have the students with the lowest test scores. The number in this group with a 1 on the select / not-select index is again group n times group proportion; call this n(low). If n(low) equals n(high), the trace for the correct option is going to have little if any slope, and the correlation between the select / not-select index and test score is going to be low.

So, what might be concluded? Items having a correct-answer trace which has a sharp dip at the left end, and rises steadily to approach the top of the plot at the right, will have a high discrimination index.

# Visually yours?

In conclusion, Lertap provides test developers and users with two fundamental methods for item analysis: a series of Stats reports with item statistics presented in different ways (Statsul, Statsb, Statsf), and a series of pictures, the quintile plots.

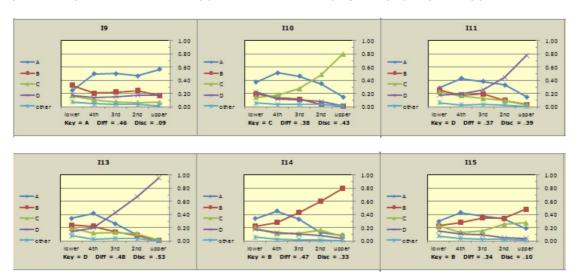
Which of these methods is better? The reports, as a group, give more information than the pictures do. The Statsf report, for example, has summary test statistics not found in the pictures, such as reliability, and the standard error of measurement estimate. The Statsb report has a single column devoted to highlighting weak distractors.

However, for assessing the performance of an individual item, the pictures have much to say for themselves. They obviate the need to understand statistical measures, such as "Diff." and "Disc.". They quickly and colourfully reveal how all item options worked.

Is this visual approach to item analysis a serious research method? Yes. Without a doubt. Is a quintile plot picture worth a thousand of Lertap's retinue of Stats reports? Hmmm ....

# Addendum (recommended additional reading)

We can take the utility of this "visual approach" to another level by having Lertap pack the plots. Here's a snippet from this web page to pique your appetite:



I9 and I15 are not discriminating well. I13 was a star performer.

Imagine, say, a 40-item test and consider how packed plots such as these might readily be used to *quickly* draw attention to poorly performing items.

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