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# Developing and Evaluating a Computerized Adapted Mathematical Test

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# The context

- New orientation procedure for the transition from primary to secondary school
- Mathematical test from November 1996
- Not many multiple choice items, some geometrical construction items
- 81 items
- Population: 3590 mostly 12 year old pupils
- Had to eliminate 7 of these items because they did not verify the assumption of local independence; hence I kept 74 items for a more thorough analysis.

# Item calibration

- Done with BILOG-MG
- Because of the lack of multiple choice items, I tried the 1 respectively 2-parameter IRT model
- Likelihood ratio test indicates that two models are valid
- But the 1-parameter IRT model 26 items with good item fit versus 67 with the 2-parameter IRT.
- Item Response Function:

$$P_j(\theta) = \frac{e^{a_j(\theta-b_j)}}{1 + e^{a_j(\theta-b_j)}}$$

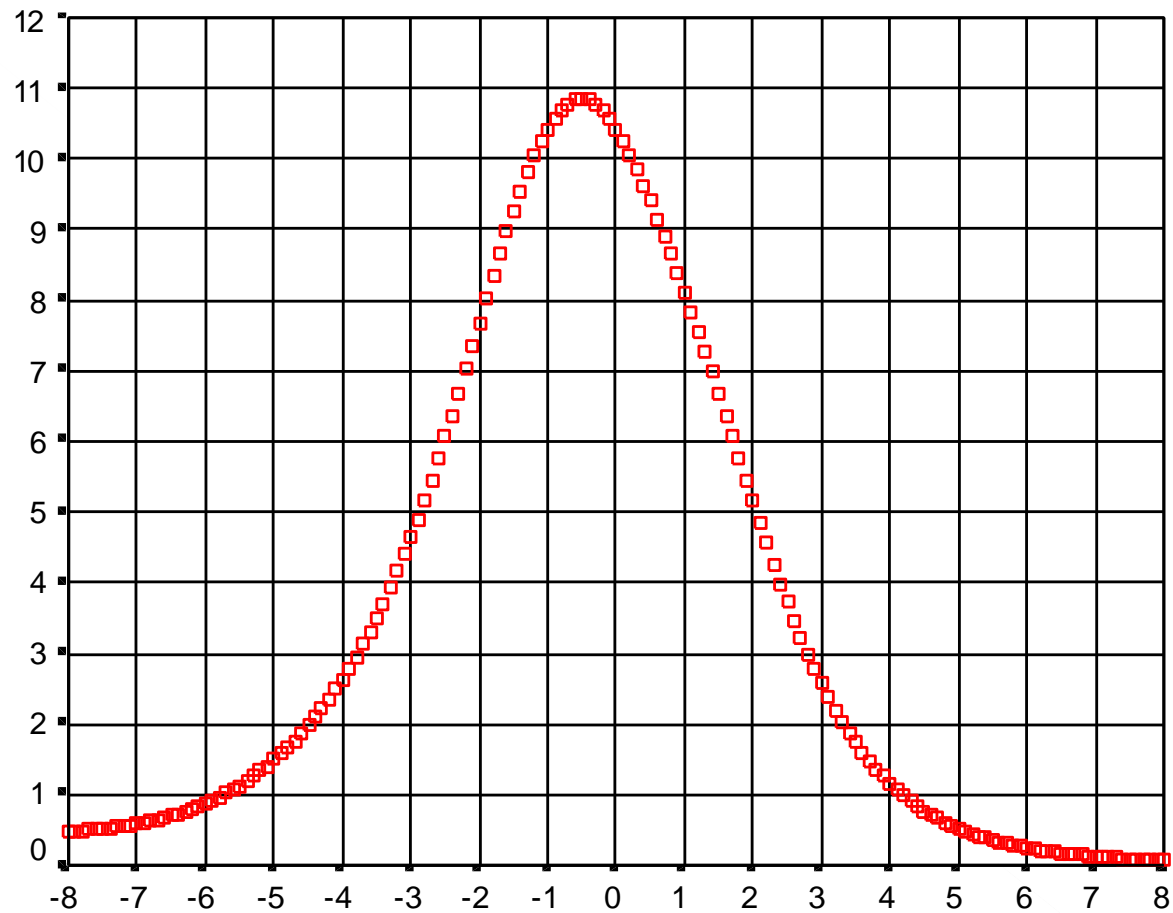
$a_j$  item slope

$b_j$  item treshold

# Checking the invariance property

- The next step consisted in eliminating the items that did not satisfy the invariance property.
- I separated the examinees population into two groups, by splitting them at the median of the mathematical ability.
- I calibrated the items separately for the two groups keeping the same distribution and eliminated the items for which the difference of the thresholds in the two groups was larger than  $1,96 \sigma$ .
- I kept a final item Pool of 63 items.

# Test information function



THETA

# Construction of the CAT

- I used the multimedia-programming platform Quest Net+ for Windows™.
- Initialisation: An item with mean difficulty (0,078) and not too strong discrimination power (0,618).

# Estimation of the math skill

- I used the Bayesian modal estimation method, supposing a normal distribution of  $\theta$ .
- Posterior function of likelihood :

$$L(\theta) = \frac{\exp\left[\sum_{i=1}^{k-1} a_{j_i} (b_{j_i} - \theta)(1 - u_{j_i})\right]}{\prod_{i=1}^{k-1} 1 + \exp -a_{j_i} (\theta - b_{j_i})} g(\theta).$$

Maximum value for

$$-\sum_{i=1}^{k-1} a_{j_i} (1 - u_{j_i}) + \sum_{i=1}^{k-1} \frac{a_{j_i} e^{a_{j_i} (b_{j_i} - \theta)}}{1 + e^{a_{j_i} (b_{j_i} - \theta)}} - 2\theta = 0,$$

# Estimation of the math skill

```
float algo (float x_0)
{
    float res, a, b;
    a=x_0-2.0;
    b=x_0+2.0;
    do {
        if (funct(a)*funct(b)<0)
            {if (funct(a)*funct((a+b)/2.0)<0) b=(a+b)/2.0;
             else a=(a+b)/2.0;}
        else a=a-1.0, b=b+1.0;
    }
    while (b-a>0.005);
    res=a;
    return res;}

```



# Choice of the next item

- Maximum information strategy:
- Item information function:  $I(\theta) = a_j^2 P_j(\theta) (1 - P_j(\theta))$ .

```
for (i=1 ; i<=63 ; i++)
```

```
    {info[i-1]=I(theta, i);}
```

```
for (i=1 ; i<=nom ; i++)
```

```
    {info[ens[i-1]-1]=0.0;}
```

```
float sup;
```

```
    int item=1;
```

```
    sup=info[0];
```

```
    for (i=2; i<=63 ; i++)
```

```
        {if (info[i-1]>sup) {sup=info[i-1];
```

```
            item=i;}}
```

# Empirical Evaluation Study

- We constructed an experimental form of our CAT and a parallel paper-and-pencil test and presented the two forms to a representative sample of 123 pupils belonging to the first year of a classical secondary school.
- To neutralize the effect of the order of presentation, the participants were distributed by randomization to two experimental groups. Group A began with the CAT and group B with the paper-and-pencil test.
- Two months later, the experimental conditions were inverted.

# Criterion one: Performance scores and success ratio

- There appears no significant difference, nor between the means of the CAT note ( $M = 0.55$ ,  $SD = 0.47$ ) and paper-and-pencil scores ( $M = 0.61$ ,  $SD = 0.65$ ) ( $t = 1.578$ ,  $p > 0.05$ ), nor between the failure ratio, which is 13.8% for the paper-and-pencil condition and 8.9% for the CAT ( $\chi^2 = 2.65$ ,  $p > 0.05$ ).
- Thus, the CAT is comparable to a classical paper-and-pencil test by its ability to measure the performances of pupils.

## Criterion two: Ability to rank pupils according to their level of performance

- The correlations between the scores on the CAT and on the paper-and-pencil test are significant ( $r = 0.593$ ,  $p < 0.01$ ), but medium-sized.
- Criterion three: Transfer and apprenticeship from one experimental condition to the other
- CAT (subgroup A:  $M = 0.5674$ ,  $SD = 0.408$ ; subgroup B:  $M = 0.5420$ ,  $SD = 0.497$ ;  $t = 0.285$ ;  $p > 0.05$ )
- Paper-and-pencil test (subgroup A: mean = 1.0093,  $SD = 0.558$ ; subgroup B: mean = 0.4668,  $SD = 0.560$ ;  $t = 5.100$ ;  $p < 0.001$ ).
- Thus, there has been a positive effect of apprenticeship from the CAT to the paper-and-pencil situation and not vice versa

# Criterion five: Relations with general intelligence

Correlations

		NOTE	NOTEPAP	GL	QU3_4	QU7_10	QU13_14	QU15
NOTE	Pearson	1	.493**	.362**	.337**	.393**	.035	.187*
	Sig. (2-tailed)	.	.000	.000	.000	.000	.705	.039
NOTEPAP	Pearson	.493**	1	.319**	.280**	.379**	.171	.131
	Sig. (2-tailed)	.000	.	.000	.002	.000	.060	.149
GL	Pearson	.362**	.319**	1	.541**	.722**	.476**	.338**
	Sig. (2-tailed)	.000	.000	.	.000	.000	.000	.000
QU3_4	Pearson	.337**	.280**	.541**	1	.461**	.353**	.197*
	Sig. (2-tailed)	.000	.002	.000	.	.000	.000	.030
QU7_10	Pearson	.393**	.379**	.722**	.461**	1	.406**	.119
	Sig. (2-tailed)	.000	.000	.000	.000	.	.000	.192
QU13_14	Pearson	.035	.171	.476**	.353**	.406**	1	.280**
	Sig. (2-tailed)	.705	.060	.000	.000	.000	.	.002
QU15	Pearson	.187*	.131	.338**	.197*	.119	.280**	1
	Sig. (2-tailed)	.039	.149	.000	.030	.192	.002	.

\*\* . Correlation is significant at the 0.01 level (2-tailed).

\* . Correlation is significant at the 0.05 level (2-tailed).

Correlations between the CAT and paper-and-pencil test scores and the general intellectual efficiency test scores.

NOTE: CAT score

NOTEPAP: paper-and-pencil score

GL: general intellectual ability

QU3\_4: reasoning

QU7\_10: spatial representation

QU13\_14: perceptual speed

QU15: computational skill