# DIAGNOSTIC TESTS IN NUMBAS

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## Motivation/History

- Many students poorly prepared for university maths and stats study.
- Need for online tailored provision of refresher lessons in basic algebra.
- Need for an 'automated' system that diagnoses students' learning needs and recommends focus areas.

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- Need for an 'automated' system that diagnoses students' learning needs and recommends focus areas.
- MESH adopted the Numbas Diagnostic Test algorithm.
- We received internal funding for development work.

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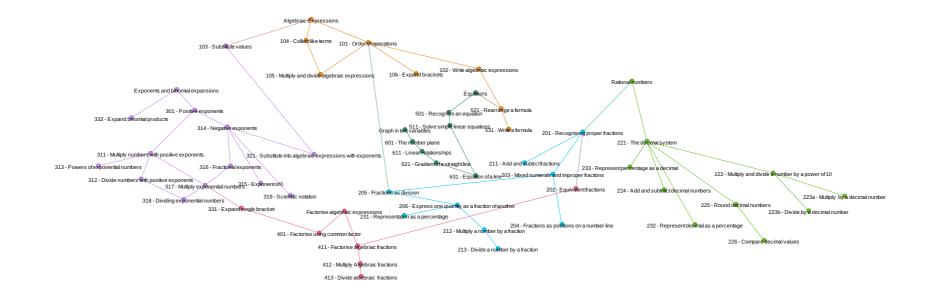
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The design has two components: a 'knowledge map' and a diagnostic tool (built in Numbas) drawing on the logic of the knowledge map.

The development involved refining the knowledge map and creating a set of Numbas questions.

### **DESIGN (KNOWLEDGE MAP)**

The knowledge map has the form of a directed acyclic graph, where nodes represent topics (questions) and edges define the topic hierarchy.



### **DESIGN (DIAGNOSTIC)**

The diagnostic tool was designed using Numbas.

- The Diagnostic exam type allows questions to be hierarchically arranged:
  - A wrong answer to a question causes the system to mark all harder questions on the same path as wrong.
  - A correct answer to a question causes the system to mark all easier questions on the same path as correct.

### DEVELOPMENT

There we three key steps in the building process:

- 1. Matching questions to topics.
- 2. Creating learning outcomes and topics within them.
- 3. Linking topics according to the knowledge map (using 'depends on'/'leads to' directives).

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This development process was recursive in the sense that matching questions to topics led to some refinement of the knowledge map.

The Numbas authoring interface allows for easy topic linking:

Topics Learning objectives A Diagnostic algorithm	
Topics	X Delete this topic
101 - Order of operations	Name 101 - Order of operations
102 - Write an algebraic expression	
103 - Substitute values	Description
104 - Collect like terms	
105 - Multiply and divide algebraic expressions	← Depends on
106 - Expand brackets	Search for a topic
201 - Recognise proper fractions	+ Leads to
202 - Equivalent fractions	Search for a topic
203 - Mixed numerals and improper fractions	102 - Write an algebraic expression 🗴 105 - Multiply and divide algebraic expressions 🗴 106 - Expand brackets 🗶 205 - Fractions as division 🗶
204 - Fractions as positions on a number line	Learning objectives
205 - Fractions as division	Search for a learning objective
206 - Express one quantity as a fraction of another	Algebraic expressions
211 - Add and subtract fractions	Questions in this topic
212 - Multiply a number by a fraction	
213 - Divide a number by a fraction	

## Implementation

The tool was offered to students in February this year. To date (22/6/2023), it has been attempted 715 times by 521 unique students.

• Some attempts were incomplete, with some having no questions answered.

## Analysis

Using attempt data from our LTI server, we have begun evaluating the diagnostic tool. Our main aim is to ensure that the knowledge map is valid and the questions based on it are properly constructed and targeted.

This is a work in progress (as determining a robust method of validation has required exploration of the research base).

Our analysis has unearthed a few unanticipated considerations:

- We have gained a deeper understanding of students' behaviour in interacting with the tool for example:
  - some quit once they got a question (or a few questions) wrong.
  - some looked ahead and then quit.
  - many complete attempts took significant time (> 45 mins).
- There is scope for feature improvements of the tool for example:
  - question sequence (perhaps a 'binary' selection?).
  - optimisation of efficiency of attempts: certain questions, if answered correctly, eliminate a large set of questions 'above' it.

#### DATA EXTRACTION, RESTRUCTURING, CLEANING

- Extraction via a JSON file.
- Restructuring and cleaning in R (dataframe with 'null' cases removed).

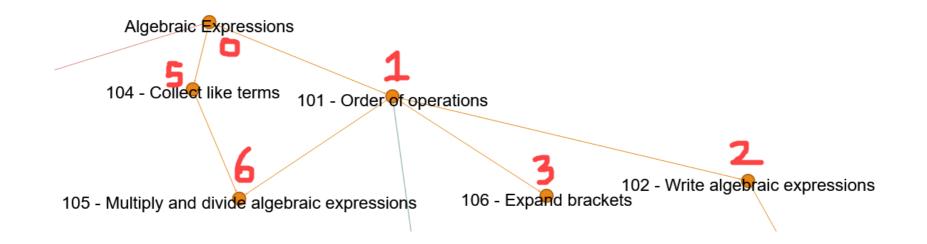
• Object
<pre>* resource: Object</pre>
pk: 386
title: "Diagnostic tool for Algebra 1"
<pre>* attempts: Array[678]</pre>
►0:Object
▶ 1: Object
► 2: Object
► 3: Object
► 4: Object
≻5:Object
v 6: Object
attempt: 31662
▶ resource: Object
exam: 534
▶ user: Object
start_time: 1682415294.43
<pre>end_time: null completion status: "incomplete"</pre>
scaled score: 0.3
raw_score: 0.3
▶ scores: Array[28]
broken: false
▶ remarked parts: Array[0]
▶ scorm: Object
▶ suspend data: Object
► 7: Object
►8:Object

#### USE OF IGRAPH PACKAGE IN R TO REPRESENT THE KNOWLEDGE MAP

Knowledge map imported into R using the igraph package.

Each item is associated with 'out' and 'in' nodes — if a student gets a question (node) wrong, then the implication is that they will get all 'out' nodes wrong (the 'zeros sink'); if they get the question right, the implication is that they will get all 'in' nodes right (the 'ones float').

 $\begin{bmatrix} 1 \end{bmatrix} 0 \rightarrow 1 \ 1 \rightarrow 2 \ 1 \rightarrow 3 \ 0 \rightarrow 4 \ 0 \rightarrow 5 \ 5 \rightarrow 6 \ 1 \rightarrow 6 \ 7 \rightarrow 8 \ 8 \rightarrow 9 \ 8 \rightarrow 10 \ 10 \rightarrow 11 \ 10 \rightarrow 12 \ 1 \rightarrow 12 \\ \begin{bmatrix} 14 \end{bmatrix} 12 \rightarrow 13 \ 13 \rightarrow 14 \ 14 \rightarrow 15 \ 13 \rightarrow 16 \ 8 \rightarrow 17 \ 7 \rightarrow 18 \ 18 \rightarrow 19 \ 19 \rightarrow 20 \ 19 \rightarrow 21 \ 18 \rightarrow 22 \ 18 \rightarrow 23 \ 23 \rightarrow 24 \ 18 \rightarrow 25 \\ \begin{bmatrix} 27 \end{bmatrix} 18 \rightarrow 26 \ 27 \rightarrow 28 \ 28 \rightarrow 29 \ 29 \rightarrow 30 \ 29 \rightarrow 31 \ 28 \rightarrow 32 \ 32 \rightarrow 33 \ 32 \rightarrow 34 \ 34 \rightarrow 35 \ 29 \rightarrow 35 \ 35 \rightarrow 36 \ 30 \rightarrow 36 \ 32 \rightarrow 37 \\ \begin{bmatrix} 40 \end{bmatrix} 32 \rightarrow 38 \ 4 \ -38 \ 35 \rightarrow 39 \ 40 \rightarrow 41 \ 39 \rightarrow 41 \ 40 \rightarrow 42 \ 9 \ -342 \ 42 \rightarrow 43 \ 43 \rightarrow 44 \ 27 \rightarrow 45 \ 46 \rightarrow 47 \ 47 \rightarrow 48 \ 46 \rightarrow 49 \\ \begin{bmatrix} 53 \end{bmatrix} 2 \ -349 \ 49 \rightarrow 50 \ 51 \rightarrow 52 \ 52 \rightarrow 53 \ 53 \rightarrow 54 \ 54 \rightarrow 55 \ 48 \rightarrow 55 \\ \end{bmatrix}$ 



#### **IMPLIED SCORING**

All non-NA raw question responses were converted to 0 or 1:

- response < 1  $\rightarrow$  response = 0
- response =  $1 \rightarrow$  response = 1

Knowing the sequence of a student's question responses, we have applied the above knowledge map logic to generate implied scores for all questions in the tool.

This has enabled the creation of 359 'fully implied scored' attempts (complete cases).

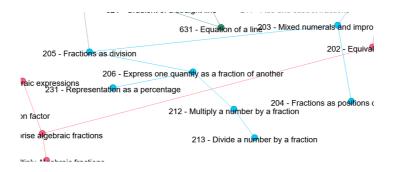
#### **RASCH MODELLING**

We have used Rasch modelling of raw and implied response sets (on complete cases only).

And compared the item difficulty rankings to glean information about questions and their place within the knowledge map hierarchy.

	1	3	4	5	6	9	12	13	14	17	18	19
	Question										RankDifference	RankDifference
1	Number	item	N (raw)	M (raw)	xsi.item (raw)	RawRank	N (implied)	M (implied)	xsi.item (implied)	ImpliedRank	Signed	Unsigned
2	11	Q11_score	62	0.20967742	0.295748491	39	359	0.86350975	-2.875035341	5	-34	34
3	46	Q46_score	112	0.83928571	-1.17161844	16	359	0.26183844	1.648897408	42	26	26
4	31	Q31_score	193	0.9119171	-1.98534228	6	359	0.4902507	0.039285652	31	25	25
5	22	Q22_score	222	0.92342342	-2.48751312	1	359	0.57103064	-0.482518206	25	24	24
6	12	Q12_score	95	0.34736842	-0.1710702	30	359	0.82729805	-2.46509587	7	-23	23
7	9	Q9_score	49	0.30612245	-0.7416318	23	359	0.90529248	-3.468403653	4	-19	19
8	37	Q37_score	24	0.75	-0.20803235	28	359	0.19220056	2.282215311	46	18	18
9	39	Q39_score	72	0.81944444	-0.12853028	31	359	0.1643454	2.578939434	49	18	18
10	16	Q16_score	55	0.45454545	-0.99499117	19	359	0.91643454	-3.661885033	3	-16	16
11	17	Q17_score	75	0.49333333	-0.88529527	20	359	0.8356546	-2.553674552	6	-14	14

Q11 (205 - Fractions as division) was found to have the greatest difference in item difficult ranking (raw vs implied). For many cases, Q11 has been assigned an implied score of 1.



VertexIDIgraph $\hat{~}$	\$ VertexNamelgraph	QuestionNumbersDiagnosticTool	outVertices $\hat{}$	inVertices $\  \   $
1	101 - Order of operations	1	c(12, 2, 3, 6, 13, 49, 14, 16, 50, 15)	NA
10	203 - Mixed numerals and improper fractions	9	c(11, 12, 13, 14, 16, 15)	8
11	204 - Fractions as positions on a number line	10	NA	c(10, 8)
12	205 - Fractions as division	11	c(13, 14, 16, 15)	c(1, 10, 8)
13	206 - Express one quantity as a fraction of another	12	c(14, 16, 15)	c(12, 1, 10, 8)
14	212 - Multiply a number by a fraction	14	15	c(13, 12, 1, 10, 8)
15	213 - Divide a number by a fraction	15	NA	c(14, 13, 12, 1, 10, 8)
16	231 - Representation as a percentage	23	NA	c(13, 12, 1, 10, 8)
17	211 - Add and subtrct fractions	13	NA	8
18	221 - The decimal system	16	c(19, 22, 23, 25, 26, 20, 21, 24)	NA

#### This might not be appropriate as Q11 contains a part that is relatively 'hard'.

Q11: 205 - Fractions as division	Q15: 213 - Divide a number by a fraction			
'Easy'	'Hard'			

