

On the impediment of logical reasoning by non-logical inferential methods

Andreas Haida, Luka Crnić & Yosef Grodzinsky

ELSC & LLCC, The Hebrew University of Jerusalem
grodzinskylab.com

September 10, 2017

Sinn und Bedeutung 22

Special session *Semantics and Natural Logic*

Drawing inferences

- ▶ Assume that sentence (A) is true. Does it follow logically that (I) is true as well?

(A) All of the Ms are Ks

(I) Some of the Ms are Ks

✓ in 73% of all trials

- ▶ Now, assume that sentence (I) is true. Can you logically infer that (O) is true, too?

(I) Some of the Ms are Ks

(O) Some of the Ms are not Ks

✓ in 94% of all trials

- ▶ Finally, is the following inference logically valid?

(A) All of the Ms are Ks

(O) Some of the Ms are not Ks

✗ in 98% of all trials

- ▶ The numbers show the results of Newstead and Griggs (1983).

Logical validity vs. perceived validity

This is how the observed behavior matches with logical behavior:

Inference	% accept expected in Aristotelian logic	% accept observed	% error
(A) to (I)	100	73	27
(I) to (O)	0	94	94
(A) to (O)	0	2	2

- ▶ What causes the two 'big' error rates?
 - Subjects compute scalar inferences (SIs).
- ▶ Why are the error rates not (close to) 100%?
 - There are different populations:
Some reasoners compute SIs, some don't.
- ▶ Why different error rates (27 vs. 94%)?
 - Again, there are different populations:
Some reasoners compute SIs for premises only.

SlS of existential sentences

- ▶ (I) sentences are systematically ambiguous:

(I) **Some of the Ms are Ks**

(I_w) *There are Ms that are Ks* (weak interpretation)

(I_s) *Only some of the Ms are Ks* (strong interpretation)

- ▶ (I_s) is derived from (I_w) by a SI:

(I_s) \equiv (I_w) \wedge \neg All of the Ms are Ks

- ▶ The same holds for (O) sentences:

(O) **Some of the Ms are not Ks**

(O_w) *There are Ms that are not Ks*

(O_s) *Only some of the Ms are not Ks* \equiv (I_s)

(O_s) \equiv (O_w) \wedge \neg All of the Ms are not Ks

- ▶ To test our hypothesis that there are different groups of reasoners with respect to SI computation, we're investigating syllogistic reasoning.

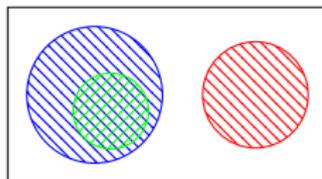
Syllogisms

- Syllogisms are arguments of the form

Premise ₁	
Premise ₂	
	Conclusion
- Here's an example of a valid syllogism:

(E) No **Italians** are **miners**
 (A) All **bikers** are **Italians**

 (E) No **bikers** are **miners**



- New sentence type: (E) sentences; hence, 4 types overall
- Each syllogism has three terms in the premises. There are 4 possible arrangements of these three terms. The term arrangement in the conclusion is fixed:



- 4 sentence types for each of the 3 lines, and 4 arrangements:
 $4^3 \times 4 = 256$ syllogisms

How ambiguity impedes syllogistic reasoning performance

- ▶ Only 24 of the 256 syllogisms are valid in Aristotelian logic.
- ▶ Previous studies observed error rates of up to > 80% in performing syllogistic reasoning.
- ▶ These studies suggest that the linguistic ambiguity of existential sentences, i.e. of (I) and (O) sentences, impedes the reasoning performance.
- ▶ Importantly, the ambiguity of existential sentences can affect the (in)validity of a syllogism differently.
- ▶ This has been observed before (Rips 1994), but we're investigating this systematically.

Syllogism classes (granularity level I)

We can identify 6 classes, which we characterize in terms of how they are affected by SI computation.

There are 2 invariant classes:

- ▶ $[-v \xrightarrow{SI} -v]$: Invalid syllogisms that are unaffected by SI computation
 - Invalid syllogisms without existential premises
 - Syllogisms that are invalid on all readings of their existential premises
- ▶ $[+v \xrightarrow{SI} +v]$: Valid syllogisms that are unaffected by SI computation
 - Valid syllogisms with an (A) or (E) conclusion

Syllogism classes (granularity level I)

There are 4 variant classes:

- ▶ $[-v \overset{SI}{\rightsquigarrow} +v]$: Invalid syllogisms that are validated by SI computation
 - Invalid syllogisms with an existential premise (a necessary but not sufficient condition)
- ▶ $[+v \overset{SI}{\rightsquigarrow} -v]$: Valid syllogisms that are invalidated by SI computation
 - Valid syllogisms with an existential conclusion
- ▶ $[-v \overset{SI}{\rightsquigarrow} \pm v]$: Invalid syllogisms that are validated by the SI of a premise but only if the SI of the conclusion is not computed
 - Invalid syllogisms with an existential premise and an existential conclusion
- ▶ $[+v \overset{SI}{\rightsquigarrow} \pm v]$: Valid syllogisms that are invalidated by the SI of the conclusion but only if the SI of a premise is not computed
 - Valid syllogisms with an existential premise and an existential conclusion

An example: how to identify class $[-v \overset{SI}{\rightsquigarrow} +v]$

- ▶ (A) and (E) conclusions can be only be validated by (A) and (E) premises.
- ▶ Thus, class $[-v \overset{SI}{\rightsquigarrow} +v]$ can only contain syllogisms with (I) or (O) conclusions.
- ▶ However, the SI of the (I) or (O) conclusion must also be validated by the premises and their SIs, or else we end up in class $[-v \overset{SI}{\rightsquigarrow} \pm v]$.
- ▶ This means we need to find a pair of valid syllogisms that differ only in that one contains (I) sentences in places v where the other contains (O) sentences.
- ▶ Luckily, Aristotelian logic gives us such a pair (but only one such pair): IA3I and OA3O.
- ▶ This means that class $[-v \overset{SI}{\rightsquigarrow} +v]$ has the following two members (and only these two members): IA3O and OA3I.
- ▶ Eventually, we wrote a theorem prover for Aristotelian logic to free us from such brain gymnastics.

Testing syllogistic reasoning performance

- ▶ We conducted an experiment with 120 participants over AMT.
- ▶ We restricted attention to 5 of the 6 classes.
- ▶ Each participant: 100 binary acceptability judgments for 20 tokens of each of 5 syllogism classes determined by the occurrence of existential sentences in premises and conclusion.
- ▶ Here are the mean acceptance rates of each class:

Class	% acc.
$[-v \rightsquigarrow -v]$	19.0
$[-v \rightsquigarrow \pm v]$	56.4
$[-v \rightsquigarrow +v]$	64.6
$[+v \rightsquigarrow -v]$	60.7
$[+v \rightsquigarrow +v]$	76.3

}?

- ▶ Some of these results are easily interpretable: e.g., syllogisms in $[+v \overset{SI}{\rightsquigarrow} +v]$ are accepted more often than those in $[-v \overset{SI}{\rightsquigarrow} -v]$.
- ▶ But what to make of the observation that e.g. syllogisms in $[-v \overset{SI}{\rightsquigarrow} +v]$ are accepted more often than those in $[-v \overset{SI}{\rightsquigarrow} \pm v]$?

Hypothesis and prediction

- There here are three groups of reasoners:

	Logicians	Validators	Strengtheners	
Premise	weak (<i>There are ...</i>)	strong (<i>Only some ...</i>)	strong	validates an invalid argument
Conclusion	weak	weak	strong	invalidates a valid argument

- We expect to observe three different behavioral patterns:

Syllogism class	Logicians	Validators	Strengtheners	
$[-v \rightsquigarrow -v]$	✗	✗	✗	invariant
$[-v \rightsquigarrow \pm v]$	✗	✓	✗	
$[-v \rightsquigarrow +v]$	✗	✓	✓	
$[+v \rightsquigarrow -v]$	✓	✓	✗	affected by ambiguity
$[+v \rightsquigarrow \pm v]$	✓	✓	✗	
$[+v \rightsquigarrow +v]$	✓	✓	✓	invariant

Results

- Now let's take another look at the mean acceptance rates:

Class	L	V	S	% acc.
$[-v \rightsquigarrow -v]$	X	X	X	19.0
$[-v \rightsquigarrow \pm v]$	X	✓	X	56.4
$[-v \rightsquigarrow +v]$	X	✓	✓	64.6
$[+v \rightsquigarrow -v]$	✓	✓	X	60.7
$[+v \rightsquigarrow +v]$	✓	✓	✓	76.3



- Green links** highlight the observations that we correctly predict. E.g., the acceptance rate of $[-v \overset{SI}{\rightsquigarrow} +v]$ is higher than that of $[-v \overset{SI}{\rightsquigarrow} \pm v]$ because of the population of strengtheners.
- However, there's also a **red link**, where we fail: Because of the logicians, we expect syllogisms in $[-v \overset{SI}{\rightsquigarrow} \pm v]$ to be accepted less often than syllogisms in $[+v \overset{SI}{\rightsquigarrow} -v]$; however, the difference doesn't reach significance.

Towards a more fine-grained classification

No significant difference between $[-v \overset{SI}{\rightsquigarrow} \pm v]$ and $[+v \overset{SI}{\rightsquigarrow} -v]$

- ▶ Reason: there's a lot of variation across the syllogisms in $[+v \overset{SI}{\rightsquigarrow} -v]$.

For example:

- ▶ A13I, IA4I: accepted ~ 80% of all times
- ▶ AE4O, EA2O: only accepted ~ 50% of all times
- ▶ Where does this variation come from?
 - ▶ A13I, IA4I: the SI of the conclusion invalidates the syllogism.
 - ▶ AE4O, EA2O: the SI is inconsistent with the premises.
- ▶ Hypothesis: Inconsistency leads to better recognition of invalidity.
- ▶ To test this hypothesis, our classification needs to take inconsistency into account.

A more fine-grained classification

Taking inconsistency into account leads to the following subclassifications:

- ▶ Subclass $[+v \overset{SI}{\rightsquigarrow} -c]$ of $[+v \overset{SI}{\rightsquigarrow} -v]$

Class	% acc. our data	% acc. Rips (1994)
$[+v \rightsquigarrow -v]$	71.3%	65%
$[+v \rightsquigarrow -c]$	51.9%	57%

- ▶ Subclass $[-v \overset{SI}{\rightsquigarrow} -c]$ of $[-v \overset{SI}{\rightsquigarrow} -v]$
- ▶ Subclass $[-c]$ of $[-v \overset{SI}{\rightsquigarrow} -v]$: Syllogisms that are formed from sets of inconsistent sentences (counterparts of valid syllogisms, where the valid conclusion is replaced by the contradictory sentence).

Class	% acc. Rips (1994)
$[-v \rightsquigarrow -v]$	10.3%
$[-v \rightsquigarrow -c]$	1.5%
$[-c]$	1%

Do the means reflect subpopulations?

- ▶ We expect that taking (SI induced) inconsistency into account will give us all the predicted differences between means.
- ▶ Let's assume that we'll indeed get the following result:

Class	L	V	S	% acc.
$[-v \rightsquigarrow -v]$	✗	✗	✗	m_1
$[-v \rightsquigarrow \pm v]$	✗	✓	✗	m_2
$[-v \rightsquigarrow +v]$	✗	✓	✓	m_3
$[+v \rightsquigarrow -v]$	✓	✓	✗	m_4
$[+v \rightsquigarrow +v]$	✓	✓	✓	m_5



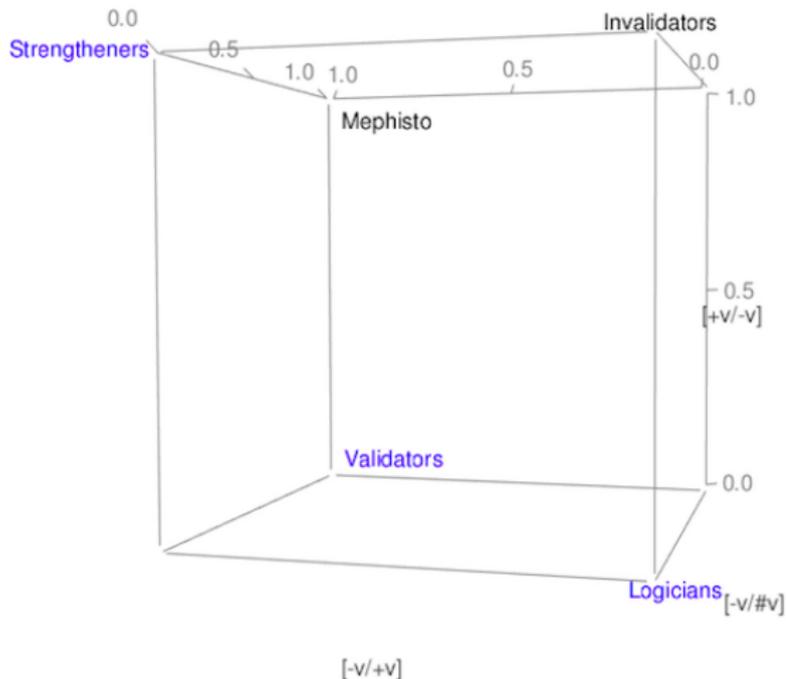
- ▶ How can we show that the means reflect homogeneous behavior within different groups and not heterogeneous behaviour of all subjects?
- ▶ Recall that every subject judged (will judge) 20 instances of each of the 5 syllogisms classes.
- ▶ This means that for every subject we have a rich behavioral profile so that we can detect (in)consistent behavior.

Do the means reflect subpopulations?

- ▶ To identify subpopulations, we used a density-based clustering algorithm: DBSCAN.
- ▶ We'll show you what DBSCAN gives us for the data of our AMT experiment.
- ▶ One thing you'll see is that the data is very noisy.
- ▶ In the AMT experiment, the reaction times show that most subjects started to give very quick responses after a while.
- ▶ To prevent this, we'll conduct our next experiment in the lab.
- ▶ However, even through the noise we can see that one of our hypothesized groups seems not to exist.

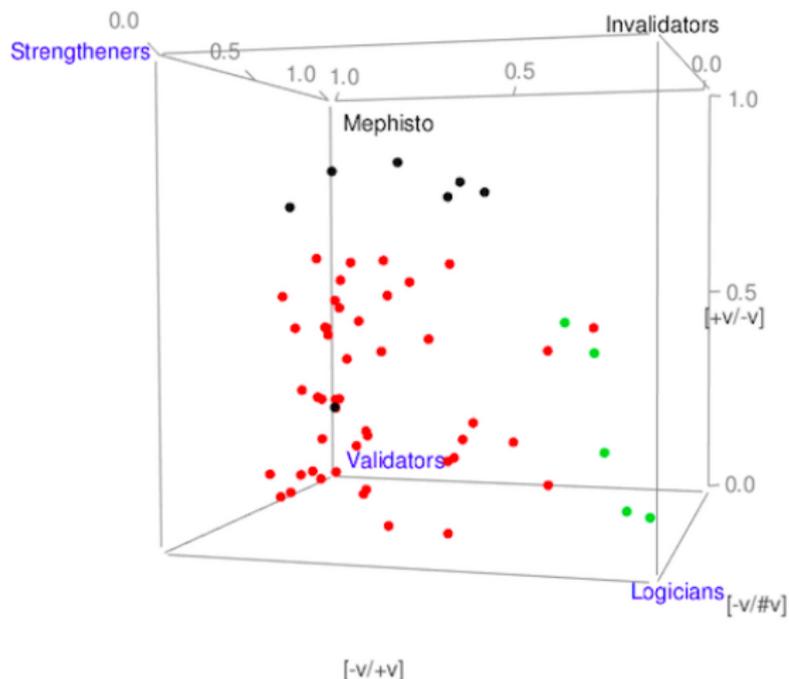
Identifying groups of reasoners

- ▶ The behavior towards the 2 invariant classes gives a measure of a subject's logical abilities.
- ▶ The behavior towards the 3 variant classes is represented by the deviance from the subject's logical abilities.



The results: two populations

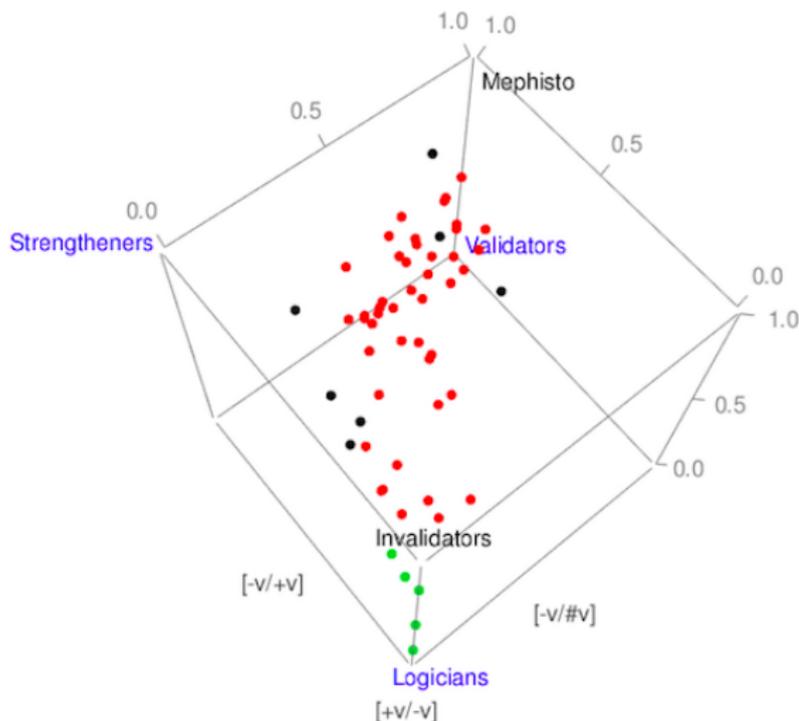
- ▶ We eliminated subjects with $> 12.5\%$ error rate in the invariant classes (half of all subjects).
- ▶ Two density clusters: **red** and **green**; outliers are black
- ▶ Members of the green cluster are in the neighborhood of the logicians' corner.



- ▶ A large group of members of the red cluster is in the neighborhood of the validators' corner.
- ▶ The strengtheners' corner is not populated.

The results: no systematic strengthening of conclusions

- ▶ Left of the diagonal: subjects that strengthen conclusions sometimes
- ▶ But: no systematic strengthening of conclusions; i.e. no strengtheners
- ▶ No evidence for other populations



Conclusions

What we did:

- (i) We developed a quantitative method to study tendencies across syllogism types.
- (ii) We showed evidence for the existence of groups of reasoners.
- (iii) We identified a supra-sentential context in which some subjects systematically do not compute SIs.

Overall, we observe behavior which is grounded in logical reasoning and natural language interpretation.

We found initial evidence for two groups of reasoners:

- ▶ subjects who consistently employ Aristotelian logic and don't compute SIs (logicians)
- ▶ subjects who consistently employ Aristotelian logic and maximize derivable inferences by computing SIs for premises but not for conclusions (validators).

Appendix: How to explain the behavior of validators?

In 27% of all (A) to (I) trials, (I) is interpreted as (I_s).

In 94% of all (I) to (O) trials, (I) is interpreted as (I_s).

- ▶ We saw evidence that there are validators.
- ▶ Let's assume that the difference above is due to this group of reasoners: they don't compute the SI of the (I) conclusion.
- ▶ How can we explain this behavior?
- ▶ We'll discuss a linguistically interesting hypothesis, and why it cannot be maintained for syllogistic reasoning.

Appendix: A hypothesis regarding the behavior of validators

- ▶ SIs serve to eliminate speaker ignorance inferences (Fox 2007).
- ▶ Validators take the premise(s) and conclusion of an argument as utterances of one and the same speaker.
- ▶ Here is how the first assumption leads to (I) to (O) inferences:

(I_w) **Some Ms are Ks**

'All Ms are Ks' is a relevant alternative and not settled by (I_w)
~> The speaker is ignorant about 'All Ms are Ks' (by quantity)

(SI) **-All Ms are Ks** (from (I_w) to eliminate the ignorance inf.)

(O_s) **Some Ms are not Ks** (by (I_w) and (SI))

- ▶ Together, the two assumptions inhibit (A) to (I) inferences:

(A) **All Ms are Ks**

(I_w) **Some Ms are Ks** (by the Aristotelian meaning of (A))

'All Ms are Ks' is a relevant alternative of (I_w)

'All Ms are Ks' is entailed, hence settled by (A)

No ignorance inference from (I_w) by quantity reasoning

No motivation to compute a SI for (I_w)

Appendix: A hypothesis regarding the behavior of validators

- ▶ Unfortunately, this account is not supported by the syllogism data that we have:

Class	% acc. our data	% acc. Rips (1994)
$[+v \rightsquigarrow -v]$	71.3%	65%
$[+v \rightsquigarrow -c]$	51.9%	57%

- ▶ Being a member of $[+v \rightsquigarrow -c]$ means that the premises entail the contradiction of the SI of the conclusion.
- ▶ Thus, the premises settle the stronger alternative to the conclusion.
- ▶ Given our assumptions, this means that there is no motivation for validators to compute the SI in the first place.
- ▶ Thus, our assumptions lead us to expect that syllogisms in $[+v \rightsquigarrow -c]$ are accepted more often than syllogisms in $[+v \rightsquigarrow -v]$, contrary to fact.