

6 decades of dabbling in intelligence

Lifetime career award from
International Society for Intelligence Research
Evanston, Illinois

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NORTHWESTERN
UNIVERSITY

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Slides available at <https://personality-project.org/sapa>

Outline

Introduction

I am a personality psychologist who studies intelligence
Research at the Personality, Motivation and Cognition lab

Motivation and cognitive efficiency

Theory development and tests

SAPA data

Astronomy as an analogy
Psychometrics of SAPA

The International Cognitive Ability Resource

The development of ICAR
Extensions and applications of ICAR

Development of the *psych* package

Conclusion

The secrets of a lifetime career award

1. Good luck
2. Great mentors
3. Great colleagues
4. Great students
5. Live long enough
6. Good luck

I am a personality psychologist who studies intelligence

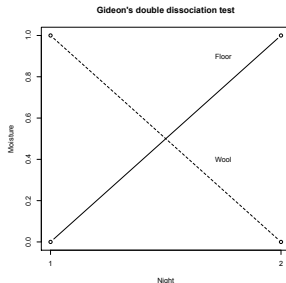
1. I have long said that personality is the last refuge of the generalist in psychology.
2. What does that mean?
 - It means that I study the interplay of Affect, Behavior, Cognition and Desire (the ABCDs)
 - That is, how one feels, acts, thinks, and wants.
3. To me, how one thinks and what one knows are fascinating problems but we have known since [Tolman and Honzik \(1930\)](#) that knowing how to do something (competence) is not the same as doing it (performance).
4. It is this interplay between competence and performance that I will address today.
5. For I believe that by understanding “non-cognitive” aspects of personality we can understand the “cognitive” aspects better.

A missionary between two fields

1. I have frequently told my American colleagues in personality that they should include intelligence and cognitive ability in their studies.
2. I have also frequently said to members of this society that they should include personality variables in their studies.
3. I have long viewed personality as including cognitive and non-cognitive aspects of the same field.
4. To these two components, I have been reminded that we should also include interests as drivers of behavioral choice.
5. In Europe, this is the field of individual differences. We should strive to include them both in our studies of human and animal behavior.

I am not the first to address this problem

1. Perhaps the first experimentalist and serious observer of motivation and competence was Gideon. He conducted a within subject study (N=1, God) which showed the first published crossover interaction.
2. More relevant was his assessment of 32,000 volunteers to choose 300 warriors involved measuring desire, affect and knowledge. (McPherson, 1901).
3. This combination of cognitive and non-cognitive aspects of personality for selection was most useful.



Plato and the requirements for leadership

Several centuries later, leadership was said to require cognitive ability and an appropriate temperament.

" ... quick intelligence, memory, sagacity, cleverness, and similar qualities, do not often grow together, and ... persons who possess them and are at the same time high-spirited and magnanimous are not so constituted by nature as to live in an orderly and peaceful and settled manner; they are driven any way by their impulses, and all solid principle goes out of them. ... On the other hand, those stable and steadfast and, it seems, more trustworthy natures, which in a battle are impregnable to fear and immovable, are equally immovable when there is anything to be learned; they are always in a torpid state, and are apt to yawn and go to sleep over any intellectual toil." [Plato \(nd\)](#)

Call for Ability-Personality Integration

2300 years later, in their call for a special issue of the *Journal of Intelligence*, Ziegler et al said:

Individual differences research focused in cognitive abilities and personality traits has been relatively successful in predicting human behavior. Very early on, interindividual difference researchers included a wide array of different constructs including personality traits and cognitive abilities. For example, Cattell (1987) proposed a theory of cognitive development which also integrated personality traits. Later, Ackerman (1996) and Ziegler, Danay, Heene, Asendorpf, and Bühner (2012) developed similarly integrative models. These models address the complex dynamic interplay between cognitive abilities and personality, which is particularly relevant from a developmental perspective.

Ziegler et al, continued:

They went on:

However, despite these efforts, there is still little sustained theory and research aimed at integrating both psychological trait foci. In fact, it sometimes appears as if two only slightly overlapping traditions have developed, each using the constructs of the other tradition only as control variables. This is unfortunate because scientists acknowledge the high relevance of addressing the interactions between cognition and personality for enhancing our understanding of human behavior.

Others have made similar claims

1. Ackerman and Heggestad (1997); Ackerman (1997, 2018); von Stumm et al. (2011) have all examined the personality-intelligence link.
2. For Germans and Austrians, the link is obvious (Brauer and Proyer, 2024) for the study of individual differences includes both temperamental and cognitive variables.
3. Ackerman (1996) reviewed the history of the study of adult intelligence continuing in the tradition of Cronbach and Snow (1981).
4. Other important work is summarized in Kanfer et al. (2014).
5. This is not new: Kelly and Fiske (1950, 1951) suggested that to predict graduate school performance one needed to assess ability, stability and interests. Students need to be able, stable and interested if they are going to succeed.
6. Matt McGue's talk today is a brilliant example of why we need to consider both.

I have addressed this challenge in a number of ways

1. Showing the interactive effect of arousal manipulations with the personality dimension of Introversion-Extraversion on cognitive performance on Graduate Record Exam like tests (Revelle et al., 1976).
2. Showing that the effects found in Revelle et al. (1976) are even more complicated than we thought, and interact with time of day (Revelle et al., 1980).
3. Trying to integrate these effects into one overall model of personality, motivation, and performance (Humphreys and Revelle, 1984).
4. Developing an open source test of ability (ICAR) so that I (and others) could include ability in any study of personality, interests, attitudes, etc. (Condon and Revelle, 2014).
5. Developing and supporting the *psych* package for R to facilitate my and my students studies.

The PMC lab: Personality, Motivation and Cognition lab

1. All of the research I will discuss today was done with many very talented undergraduate and graduate students, some of whom continue to work with me, as well as colleagues at NU and around the world.
2. Broadly summarizing our research goals, we have labeled our lab as the *Personality, Motivation and Cognition* lab (PMC) although sometimes we also refer to it as the *Telemetrics* lab.
3. Without the collaboration and inspiration of these students and colleagues my research would have been much more boring.

Motivational effects on cognitive processing

1. After I graduated from Pomona and married Eleanor, we went to Sarawak, Malaysia where I taught 6th grade and Eleanor 1st and then 2nd grade in a small (very) upriver school.
2. Following the British System, entrance to secondary school required passing the Common Entrance Examination (set by educators in Cambridge).
3. While the national pass rate was 30%, the pass rate at Nanga Medamit was 0%,
4. My job was to teach enough English, Math, and Social Studies so that my students could get into secondary school.
5. The parents of the children had never been to school, some parents had been headhunters.
6. At the end of the first year, 7 of 18 passed, the second year led to 14 out of 20.
7. This led to my skepticism of cultural differences in ability in that with intense training we could move scores > 2.5 sigma.

Graduate school: measurement, development and motivation

1. In graduate school I was technically supervised by Don Brown but worked also with Warren Norman, Dick Nisbett, Jack Atkinson and Jim Kulik.
2. As long as I could program the data analysis for a developmental study on the effects of cluster colleges on student change ([Newcomb et al., 1970, 1971](#)), I was allowed to “follow my nose” - always the best advice for researchers.
3. This led to some psychometric work on cluster analysis with Jim Kulik ([Kulik et al., 1970](#)) as well as TAing for Jack Atkinson.
4. While in Peace Corps I had read (devored) books by Hans Eysenck ([Eysenck, 1953, 1965, 1964](#)) and then in graduate school tried to integrate his work with that of Atkinson ([Atkinson, 1957, 1964, 1974](#)).

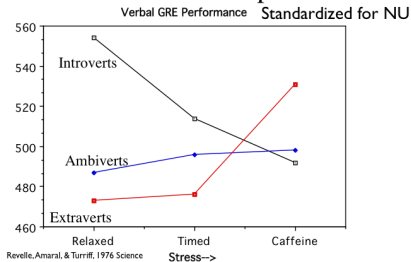
Motivation and the efficiency of performance

1. My dissertation was an ambitious (but unsuccessful) attempt to show how combining experimental manipulations with personality could produce evidence for the Yerkes-Dodson “Law” (Yerkes and Dodson, 1908).
2. Most previous demonstrations had been dreadfully underpowered or designed so that most results could be interpreted as supportive.
3. Thus I designed a study to confirm the predictions from Eysenck that stress should interact with introversion-extraversion and lead to a lower peak level for introverts than for extraverts.
4. Following the findings of Zajonc (1965) I used group size (1 vs 2 vs 8 person groups) as social stressors. Other additive stressors were competition, monetary incentive and a loud noise. The results were non-supportive of my hypothesis.

Caffeine as a stressor

1. When discussing my failed results with an advanced undergraduate class, two students suggested;
 - Using practice Graduate Record Exams (GRE) as the stimulus material.
 - Use time stress and caffeine as stressors.
2. Their results were very impressive. (Revelle et al., 1976).
3. I have always been thankful for the suggestions of Phyllis Amaral and Susan Turriff.

Introversion, time pressure, and caffeine: effect on verbal performance

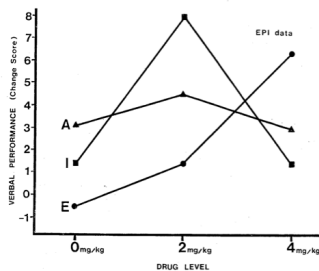


Stress reduced the performance of the introverted group by $.6 \sigma$ while helping the extraverted group by $.6 \sigma$.

Failures to replicate explained

1. A graduate student, Kirby Gilliland, suggested that the prior study using 200 mg of caffeine should have been dosed by body weight (0, 2, or 4 mg/kg of caffeine). He also used the new and “improved” measure of Extraversion, the Eysenck Personality Questionnaire (Eysenck and Eysenck, 1975).
2. But the results did not replicate the Revelle et al. (1976) unless we use the older version, the Eysenck Personality Inventory (Eysenck and Eysenck, 1964)

Extraversion, Caffeine, and Cognitive Performance



Gilliland, 1976

Figure 9. EPI based group means for change in number of items correctly answered on GRE practice tests.

Subsequent replications and extension

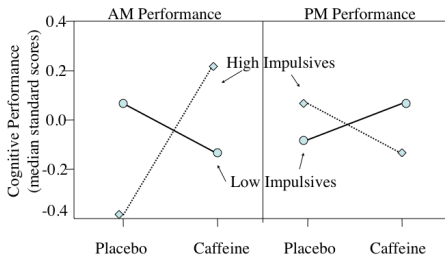
With my cognitive colleague, Mike Humphreys, and some very determined graduate students, we finally solved the replicability problem ([Revelle et al., 1980](#)).

The crucial variable was impulsivity from the EPI, not the social extraversion as measured by the EPQ.

In addition the effects varied by time of day.

- Every study in the morning showed that low impulsives got worse but high impulsives better when given caffeine.
- This effect reversed in the evening where now the high impulsives got worse and the lower impulsives better with caffeine.

Impulsivity, Caffeine, and Time of Day:
the effect on complex cognitive performance



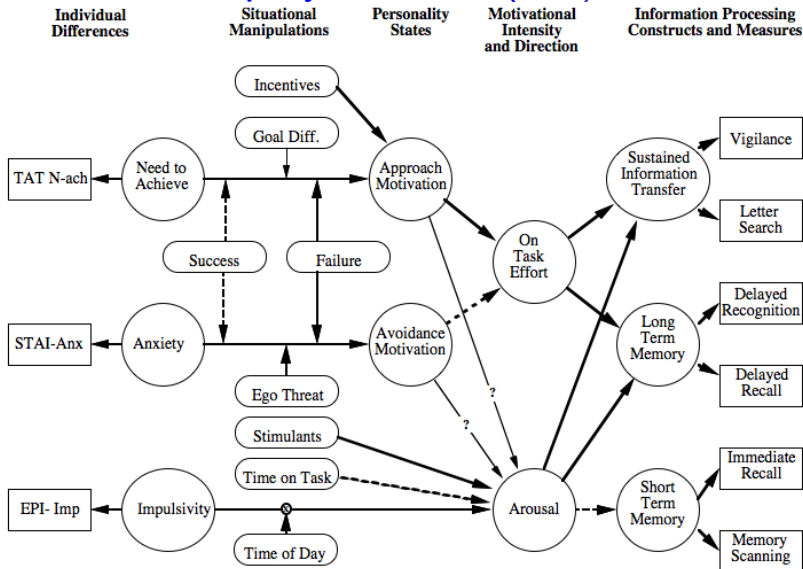
Theory development

1. Mike Humphreys and I tried to integrate our results with the theoretical contributions of [Atkinson \(1964, 1974\)](#), [Eysenck \(1983\)](#), and [Gray \(1970\)](#).
2. We wanted to explain how personality and motivational stress interacted to affect cognitive performance.
3. We also wanted to explain the [Yerkes and Dodson \(1908\)](#) “law”.
4. We considered three personality traits, the need to achieve, anxiety, and impulsivity.
5. These traits then combined or interacted with situational stressors such as incentives, goal difficulty, ego threat, stimulant drugs, time on task and time of day to affect two motivational variables.
6. We interpreted motivation in terms of direction (on-task effort) and arousal.

Theory development (continued)

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5. These traits then combined or interacted with situational stressors such as incentives, goal difficulty, ego threat, stimulant drugs, time on task and time of day to affect two motivational variables.
6. We interpreted motivation in terms of direction (on-task effort) and arousal.
7. These two components then effect “Sustained Information Transfer” (aka attention), Long term memory and Short term memory.
8. At the time we wrote this paper, we assumed the only people who would ever read it had already reviewed it ([Humphreys and Revelle, 1984](#)).

The Humphreys and Revelle (1984) model



Adapted from Humphreys & Revelle, 1984; Revelle, 1989

Yerkes Dodson as two opposing processes

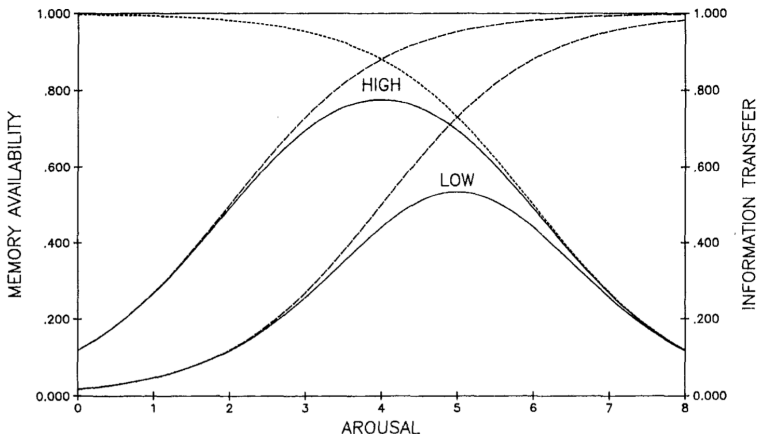


Figure 5. Curvilinearity derived from two opposing monotonic processes. (The effects of effort are to improve the information-transfer resource but not to affect the memory resource.)

Non-monotonicity as a sign of two processes

1. When discussing our results with Clyde Coombs he commented, that of course whenever you have a non-monotonic effect that represents the combination of two monotonic processes ([Coombs and Avrunin, 1977](#)).
2. The implication is to look for independent processes whenever faced with non-monotonicity,
3. Note that most phenomena are non-linear, but still monotonic.
 - This non-linearity but monotonicity can lead to many interactions that are mere effects of the scaling.
 - This is a particular problem with the study of ability for the problem of ceiling and floor effects has led to many false inferences.

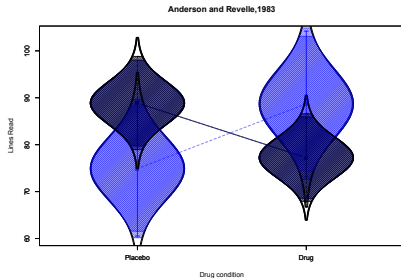
Test of theories

1. With Kris Anderson, we tested theories of motivational affects on cognitive performance and examined performance on proof reading to test the Easterbrook hypothesis ([Anderson and Revelle, 1982](#)) and performance on a visual search task ([Anderson and Revelle, 1983](#)).
2. Kris and I also discussed the complexities of theory testing and the power of interactive designs in assessing personality-performance relationships ([Revelle et al., 1987](#)).
3. With Marjorie Leon we tested three theoretical models of why anxiety impedes cognitive performance ([Leon and Revelle, 1985](#)).
4. With Deb Loftus we reviewed and tested various explanations of the effect of arousal on short and long term memory [Revelle and Loftus \(1990, 1992\)](#).



Arousal and the Easterbrook hypothesis

1. With Kris Anderson, we tested theories of motivational affects on cognitive performance and examined performance on proof reading to test the Easterbrook hypothesis ([Anderson and Revelle, 1982](#)) and performance on a visual search task ([Anderson and Revelle, 1983](#)).
2. Kris and I also discussed the complexities of theory testing and the power of interactive designs in assessing personality-performance relationships ([Revelle et al., 1987](#)).



Tests of three theories of the effect of anxiety on cognitive processing

1. Does anxiety hurt performance by distracting attention (Wine, 1971)?
2. Or does anxiety hurt working memory (Eysenck, 1979)?
3. Marjorie Leon and I examined the effects of anxiety on visual analogies varying in memory load and total processing demands (Leon and Revelle, 1985)

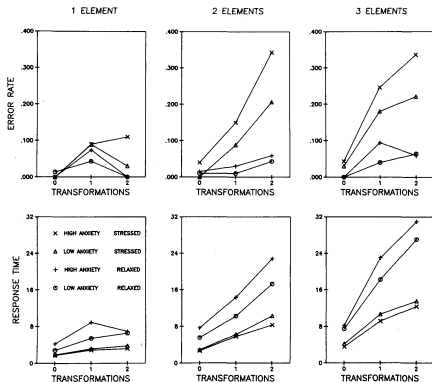
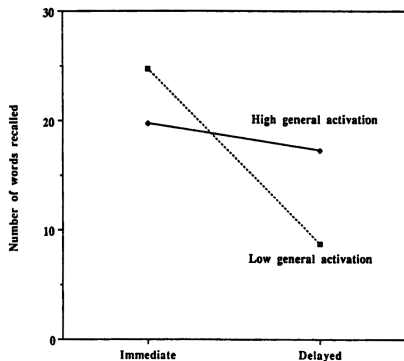


Figure 3. Error rates and response times for true analogies. (Error rates are calculated for all true analogies. Response times are calculated for true analogies that were solved correctly.)

The effect of exercise and arousal on memory

1. There are some strange results suggesting that arousal hurts immediate memory but facilitates long term memory (Geen, 1984)
2. Deb Loftus and I reviewed these non-intuitive findings (Revelle and Loftus, 1992) and then tested the effect with an exercise manipulation (Revelle and Loftus, 1990).

Exercise induced high activation did indeed hurt short term but help long term memory.



SAPA: the Synthetic Aperture Personality Assessment Project

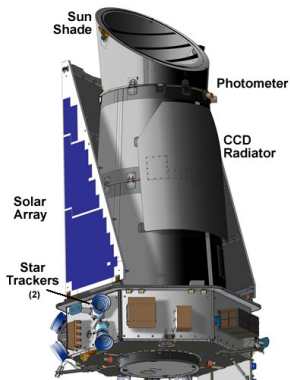
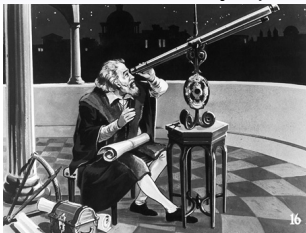
1. Over the past 20 years, we have been collecting data from the web using what we call the [SAPA project](#).
2. Using a Massively Missing Completely at Random (MMCAR) design, we present 50-250 items sampled from > 6400 items.
3. Items are sampled at different rates, some with a sampling frequency of 1%, some 25%-50%. demographic items are given to everybody.
4. Of the items given, a core set of 135 temperament items (the SAPA Personality Inventory or SPI, [Condon, 2018](#)) and 60 items from the International Cognitive Ability Resource (ICAR-60 [Condon and Revelle, 2014](#)) are oversampled.
5. The SPI items as well as many of the other items were originally taken from the International Personality Item Pool (IPIP [Goldberg et al., 2006](#)).

What is SAPA and how does it work: FAQ

1. Why is it called Synthetic Aperture Personality Assessment (SAPA)?
2. If items are missing 95% of the time, how can you possibly measure anything?

A now for something completely different: astronomy

Resolution varies by aperture diameter (bigger is better)



A short diversion: history of radio telescopes

Just as with optical telescopes, resolution varies by aperture diameter (bigger is still better)



Aperture can be *synthetically* increased across multiple telescopes or even multiple observatories



Can we increase N (subjects) and n (items) at the same time?

1. Frederic Lord (1955) introduced the concept of sampling people as well as items.
2. Apply basic sampling theory to include not just people (well known) but also to sample items within a domain (less well known).
3. Basic principle of Item Response Theory and tailored tests.
4. Used by Educational Testing Service (ETS) to pilot items.
5. Used by Programme for International Student Assessment (PISA) in incomplete block design (Anderson et al., 2007).
6. Can we use this procedure for the study of individual differences without being a large company?
7. Yes, apply the techniques of radio astronomy to combine measures synthetically and take advantage of the web.
8. My colleagues and I have discussed this technique for several years as a way of embracing your missingness (Revelle et al., 2010, 2017).

The basic problem: Fidelity versus bandwidth

1. Many personality traits, interests and cognitive abilities are multidimensional and have complex structure.
 - To measure these, we need to have the precision that comes with many participants.
 - But we also need the bandwidth that comes with many items.
 - But participants are reluctant to answer very many items.
2. This has led to the quandary of should you give many people a few items or a few people, many items?
3. Our answer is to do both, but with a *Massively Missing Completely At Random* (MMCAR) data structure.
4. We refer to this technique as *Synthetic Aperture Personality Assessment* (SAPA) to recognize the analogy to synthetic aperture radio astronomy ([Revelle et al., 2010, 2017](#)).
5. This is functionally what Frederic [Lord \(1955, 1977\)](#) suggested 65 years ago. It is time to take him seriously.

SAPA overview

1. At the sapa-project.org we use Synthetic Aperture Personality Assessment (SAPA) methods to assess $\approx 30 - 100K$ participants per month. This is just a technique of Massively Missing Completely at Random (MMCAR) data presentation. Each participant is given a random subset of items chosen from an item pool of more than 6600 items. These items, extended from the [International Personality Item Pool](#) (Goldberg, 1999) and the [International Cognitive Ability Resource](#) (Condon and Revelle, 2014; Revelle et al., 2020), assess temperament, cognitive ability, interests and attitudes as well as self reported behaviors and demographic information.
2. Conventional psychometric techniques (both classical and IRT) are used to identify homogeneous scales; empirical item selection procedures are use to develop optimal item composites to predict a wide range of criteria. Data analysis code is done using the *psych* package (Revelle, 2025) in R (R Core Team,

Lord (1955) and matrix sampling

1. Given an N (subjects) by n (item) matrix, we can sample:
2. Type 1: Subjects – basic statistical theory
 - \bar{x} and its standard error $\sqrt{\frac{\sigma^2}{N-1}}$
 - r_{xy} and its standard error $\sqrt{\frac{1-r^2}{N-2}}$
3. Type 2: Items – this is the basis of classical reliability theory especially domain sampling (Tryon, 1957, 1959):
 - $KR_{20} = \alpha = \lambda_3$ represent the correlation of a test with a test just like it sampled from a larger population of items.
 - ω_h and ω_t similarly are estimates of what the general factor, ω_h , or total, ω_t , correlation would be with another representation in the domain. (See Revelle and Condon, 2019, for everything you want to know about reliability but were afraid to ask).
4. Type 12: Matrix sampling of subjects and items
 - Special case is balanced incomplete blocks (BIB).
 - General case is Missing Completely at Random (MCAR).

3 Methods of collecting 256 subject * items data

1) 8 x 32 complete 2) 32 x 8 complete 12) 32 x 32 MCAR $p=.25$

46213634521143453443645331212414
21243623166421516154432261516513
51661351155165463622224435623344
11141343362332215612152135614522
25353121264561433433232246526411
61335154566424114612641225353516
24634342151536242425413513435116
11554654453123111162423325516334

Type 1 = sample subjects

Type 2 = sample items

Type 12 sample items and subjects

46323114
25443314
43315423
26314145
41435614
42236153
62421344
35234443
34514166
63415154
44441342
13514321
66365663
12264546
31466135
32645514
66151251
14411441
62443636
33316236
63325425
11531126
61155546
33245361
52241654
63212356
24414663
63661414
45555223
14364433
21461416

..3..2..6....4.55.....44.....
.....4..6..45..3.4..6....1
6..3.....6.1.....6.2.....5.6
...3522.....5.3...3.....5...
...3.2.2.....3..2.....65..5.
...51...324.....23.....5
...552.....25...54.5...
...44.4.5...3..6...6.....3..
...61.523.2...2.....3..
5.....42.4..6.5.....61.
...3...3.6..1.4...1.5.....5.
1...54.....2.4.33..6.....
4.....52..6....44.3.....2
..44...1.....1..42...5..1..
..1..3.....2..3.521.....6..
.....3.142.....22.....12..
..4...2.....3..162...4....4
..4..6..3.4...1...5.33.....
5.....243..5...41.....1..
..5..3..4...4.4..5..1.....4.
...4.....3..5.2.....64.4..4.
...1.1.2...6...4.....55...2..
...3..2..53.....2..2.3.3.....
.....1...2..43...3.13.....5.
...2.....4..54...2.3..62...
22.....332..1.....5.....6..
...5..3.4.....3...5.241.....
.....63.1.....6...5..4..2...5
..2.4..5.....52.4....44...
2.55.....2.....6.....6.....55
5.....4.....6241..4..2

3 Methods of collecting 256 subject * items data

1) complete (Ideal)

2) Sample people

3) Items

22552141414336514122645166143244
32144265454235634562343524256611
43553143152141541641526114551151
5265422344561444431162645313124
6222255242315442652355414213325
22125412454242154221456444214564
65113311244511226522615346451412
54436452425245244554632246526466
55223643555215245514633426121226
3552254332366426534665545131612
6326124134146631124322223323541
32224431433144451645255464435552
11564655513111334341463561655541
24532624664444656366642463322555
25516362264523255665245644125611
32255635422342631523143414221354
232444566314111361161615126144214
34526633236542563633625123624421
13451522616451531355135621451536
31625444241623135123121345134162
44252526365556663522524162313453
54361436651313615433261662235132
46635454552135645224352362433436
26511624245416441145655363265265
63512331235542645524352562623235
11523665433656446452523322216333
56436532623253433145633663651242
15136366233651513351113353151452
46321152211446344326554442255226
62156523111352364233551656146433
65242552326523552323632365156132633

22552141414336514122645166143244	22552141
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55223643555215245514633426121226	55223643
.....	35522554
63261241341466311243222233323541	63261241
.....	32224431
11564655513111334341463561655541	11564655
.....	24532624
.....	25516362
.....	32255635
.....	23244456
.....	34526633
13451522616451531355135621451536	13451522
.....	31625444
.....	44252526
.....	54361436
46635454552135645224352362433436	46635454
.....	26511624
.....	63512331
11523665433656446452523322216333	11523665
.....	56436532
.....	15136366
.....	46321152
.....	62156523
6524255026522562226222615612622	65242555

12 (Matrix) Sampling Methods of collecting 256 subject * items data

a) 32 x 16 balanced incomplete b) 32 x 8 complete c) 32 x 32 MCAR $p=.25$

.....4122645166143244
.....4562343524256611
.....1641526114551151
.....4431162645313124
.....2652355414213325
.....45424215.....44214564
.....24451122.....46451412
.....42524524.....46526466
.....55521524.....26121226
.....33266426.....51531612
.....3414663112432222.....
.....4331444516452554.....
.....5131113343414635.....

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...552.....25...54.5..
..44.4.5....3..6...6.....3
...61.523.2.....2.....3..
5.....3.....42.4..6.5.....6
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4.....52..6.....44.3.....
..44...1.....1..42...5..1..
..1..3.....2..3.521.....6..
.....3.142.....22.....1..
..4...2.....3..162...4...
..4..6..3.4...1...5.33.....
5.....243..5...41.....1..
..5..3..4...4.4..5..1.....
...4.....3..5.2.....64.4..
...1.1.2...6...4.....55...2
...3..2..53.....2..2.3.3...
.....1...2..43...3.13.....
...2.....4..54...2.3..62..
22.....332..1.....5.....6..
...5..3.4.....3.....5.241..
.....63.1.....6...5..4..2..
..2.4..5.....52.4.....44..
2.55.....2.....6.....6.38/655.
5.....4.....6341.4..2..

Using SAPA to study the structure of personality

1. With the ability to build up large correlation matrices from the MMCAR data we were able to examine personality structure.
2. Josh Wilt developed his ABCD scales using items specifically emphasizing Affective, Behavioral, Cognitive or Motivational (Desire) content ([Wilt and Revelle, 2015](#))
3. David Condon examined the structure of 696 items from the IPIP that were common to many published scales. From these 696 he was able to identify 135 that sampled the big few quite well, but also could be used to measure 27 “little” or interstitial factors [Condon \(2018\)](#).

The International Cognitive Ability Resource: measuring intelligence on the web

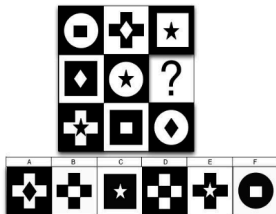
1. Wanting to broaden some web based research we had started to study Right Wing Authoritarianism with Greg Laun ([Revelle and Laun, 2004](#)), Melissa Liebert, another very clever undergraduate, developed some preliminary items to measure cognitive ability as part of a study of musical preferences ([Liebert, 2006](#)).
2. At a meeting in Krakow we reported the first use of our web based ability items and discussed how they relate to other dimensions of individual differences ([Revelle et al., 2010](#)).

ICAR (Condon and Revelle, 2014)

1. David Condon then took this beginning set of items and improved them as well validating them against a standard test of ability (the [Shibley, 2009](#)) and national data of the ability scores of college majors.
2. With some European colleagues, this resulted in the ICAR, an open source measure of cognitive ability. ([Condon and Revelle, 2014](#)).
3. In 2014 we released the first public domain version of what has become the ICAR.
4. The original 4 domains measured in the ICAR were
 - 9 Letter and Number Series items,
 - 11 Matrix Reasoning items,
 - 16 Verbal Reasoning items
 - 24 Three-Dimensional Rotation
5. A 16 item subset of the measure, the *ICAR Sample Test*, aka ICAR16 was a balanced set of 4 from each domain.

Example ICAR items

Matrix Reasoning



Verbal Reasoning

What number is one fifth of one fourth of one ninth of 90

- (1) 2 (2) 3 (3) 4 (4) 5 (5) 6 (6) 7

If the day after tomorrow is two days before Thursday,
then what day is it today?

- (1) Friday (2) Monday (3) Wednesday
(4) Saturday (5) Tuesday (6) Sunday

Letter and Number Series

In the following alphanumeric series, what letter comes next?

I J L O S

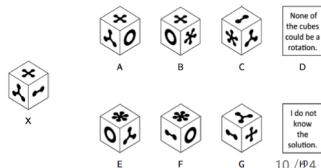
- (1) T (2) U (3) V (4) X (5) Y (6) Z

In the following alphanumeric series, what letter comes next?

Q S N P L

- (1) J (2) H (3) I (4) N (5) M (6) L

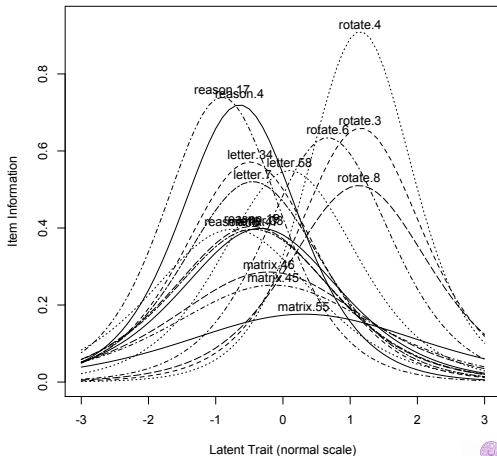
Three-Dimensional Rotation



Item information for the ICAR 16

1. In the spirit of open science, data for 1525 participants on the ICAR16 are available in *psychtools* in R
2. The information curves are drawn using the `irt.fa` function in *psych*, which, like most of the functions in *psych*, was developed to handle the severe missingness of our SAPA data.

Item information from factor analysis



The development of ICAR

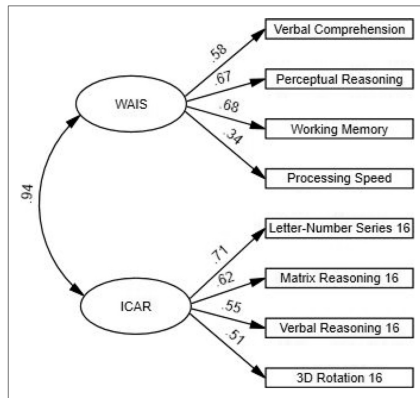
1. Subsequent item development and validation has extended the original four domains to > 19 item types.
2. Additional cognitive items have been developed by David Condon and our other colleagues at the ICAR project ([Gühne et al., 2020](#))
3. The newer measures include a
 - forced choice compound remote associates test ([Mather et al., 2024](#))
 - two dimensional rotations ([Mather and Condon, 2023](#))
 - propositional reasoning
 - figural analogies
 - numeracy,
 - map use
 - more complex matrix reasoning problems
 - Computer generated number series have been validated against the original items and added to ICAR ([Loe et al., 2018](#)).

Ripoff or useful?

1. When David, Liz and I submitted an article to *Current Directions* one reviewer suggested that to compare the ICAR to the Stanford Binet is analogous to comparing a cheap ripoff to a Versace handbag.
2. However, not everyone can afford a Versace handbag.
3. We view the utility of ICAR in terms of its wide range of applications in just the past few years.
4. Measurement invariance was tested for by [Young et al. \(2019\)](#).
5. The validity data correlating with “gold standard” measures found a correlation of .81 with the full scale IQ .94 with the CFA estimated “g” factor ([Young and Keith, 2020](#)).
6. There are at least 232 uses of the ICAR in the recent literature (79 in [Dworak et al., 2021](#), 153 since then), Dworak (personal communication, 2025).

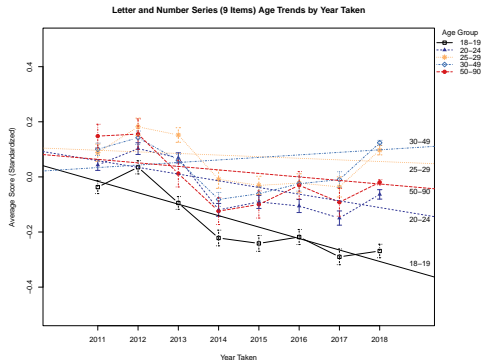
Validation vs the WAIS

1. Young and Keith (2020) reported validity data correlating with “gold standard” measures found a correlation of .81 with the full scale IQ from the WAIS and .94 with the CFA estimated “g” factor.



ICAR over time: examining the Flynn Effect

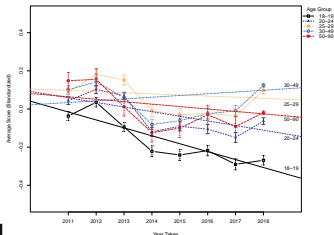
1. Elizabeth Dworak, David Condon and I have reported SAPA based ICAR data over time, showing changes (or lack of changes) over 8 years ([Dworak et al., 2023](#)).
2. We needed to correct for various changes in the ICAR over the years as new items were added.



Extensions and applications of ICAR

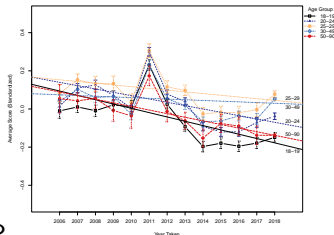
ICAR changes over 8 years by age vary by subtest

Letter and Number Series (9 Items) Age Trends by Year Taken



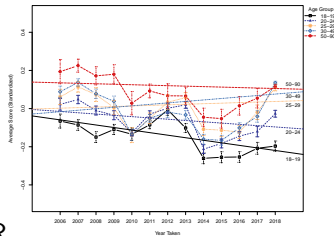
LN

Matrix Reasoning Age Trends by Year Taken



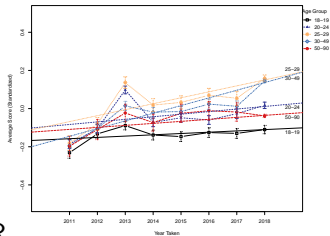
MR

Verbal Reasoning Age Trends by Year Taken



VR

Three-Dimensional Rotation Age Trends by Year Taken



3DR

ICAR extensions: Compound Remote Associates Test

1. [Mednick \(1962\)](#) had popularized the use of remote associations as they relate to intelligence and creativity.
2. [Bowden and Jung-Beeman \(2003\)](#) gave normative results for compound remote associate tests which they related to the “Ah ha” or insight effect.
3. David Condon generalized the Remote Associates Test to a multiple choice format which is now being given on the SAPA site.
 - Consider the words pine, crab, sauce
 - The word that links these three words starts with s, d, t, r, b, a, none of these, I don't know.
4. [Mather et al. \(2024\)](#) report the development and validation of the multiple-choice compound remote associates test.

College majors with high scores on the CRAT

Table 3 Top-scoring university majors in descending order of percentile rank on associative ability

Major	CRA	LN	MR	R3D	VR	FA	PR
Classical languages (Latin and Greek)	99	84	85	97	99	95	93
American studies	99	59	75	72	94	63	97
Poetry writing	98	70	66	68	77	68	75
Fiction writing	97	66	69	73	86	62	95
Anthropology	97	80	75	93	97	84	96
Neuroscience	96	100	100	100	100	100	100
Comparative literature studies	95	77	68	75	84	71	83
Classical studies	94	57	70	92	95	86	92
Spanish	93	64	60	67	97	56	82
Slavic languages	92	82	87	68	98	77	98

Notes: The majors are sorted by percentile on the new CRA item set. Percentile ranks for other cognitive abilities are also presented. LN = letter-number series, MR = matrix reasoning, R3D = three-dimensional rotation, VR = verbal reasoning, FA = figural analogies, PR = propositional reasoning

The percentiles of scores on the CRAT as well as Letter-Number series, Matrix Reasoning, 3 dimensional rotation, Verbal Reasoning, Figural Analogies and Propositional Reasoning are shown as well ([Mather et al., 2024](#))

Occupations with high scores on the CRAT

Table 4 Top-scoring occupations in descending order of percentile rank on associative ability

Occupation	CRA	LN	MR	R3D	VR	FA	PR
Education administrator – postsecondary	96	90	70	86	92	60	84
Writer	95	68	54	57	75	66	73
Physicist	94	98	98	99	97	97	97
Postsecondary teacher – philosophy or religion	94	87	87	78	90	92	93
Editor	93	69	66	77	84	71	78
Environmental scientist	93	92	87	86	93	87	94
Veterinarian	92	81	82	83	79	77	83
Other – biological scientist	92	94	96	95	96	94	95
Postsecondary teacher - mathematical science	91	93	93	93	88	83	94
Regulatory affairs manager	91	75	70	62	91	86	95

Notes: The majors are sorted by percentile on the new CRA item set. Percentile ranks for other cognitive abilities are also presented. LN = letter-number series, MR = matrix reasoning, R3D = three-dimensional rotation, VR = verbal reasoning, FA = figural analogies, PR = propositional reasoning

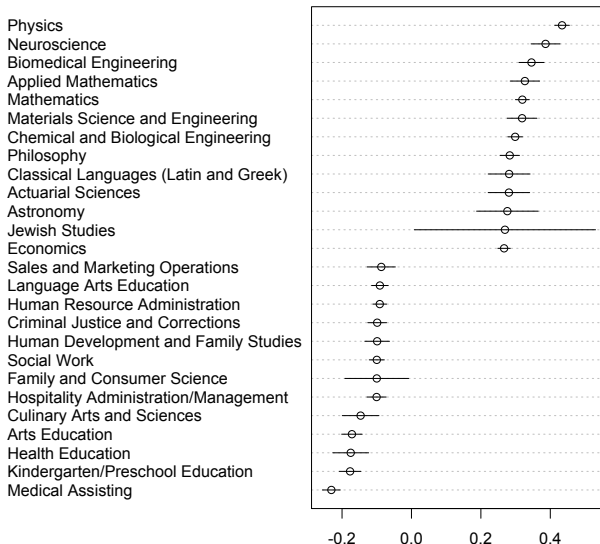
The percentiles of scores on the CRAT as well as Letter-Number series, Matrix Reasoning, 3 dimensional rotation, Verbal Reasoning, Figural Analogies and Propositional Reasoning are shown as well ([Mather et al., 2024](#))

ICAR and the subtests

1. From 644,495 SAPA subjects from 2017-2019 I looked at ICAR and SPI scores by major.
2. The SAPA Personality Inventory (SPI) ([Condon, 2018](#)) has 135 items formed into five broad factors and 27 interstitial factors.
3. What follows is a very quick summary of the ICAR dimensions and a few of the SPI dimensions.

Extensions and applications of ICAR

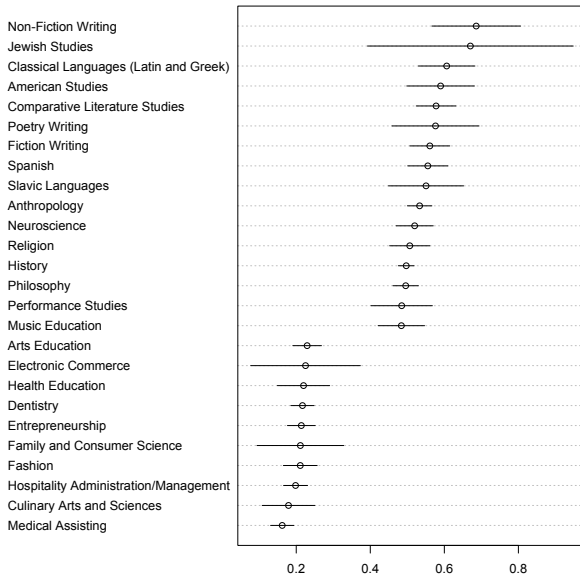
ICAR60 by major





Extensions and applications of ICAR

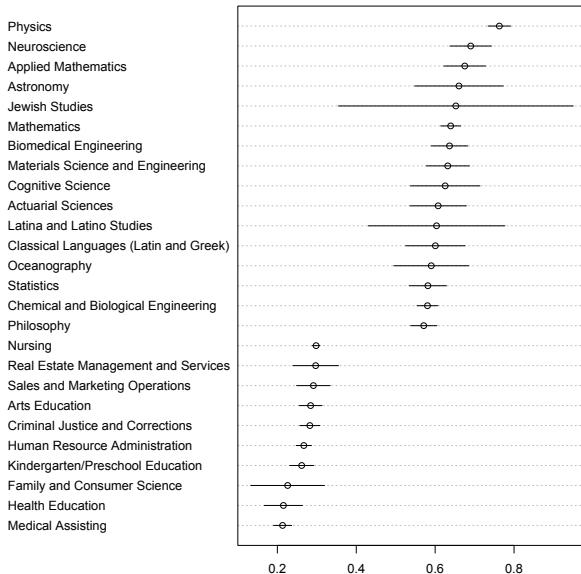
Compound Remote Associates by major





Extensions and applications of ICAR

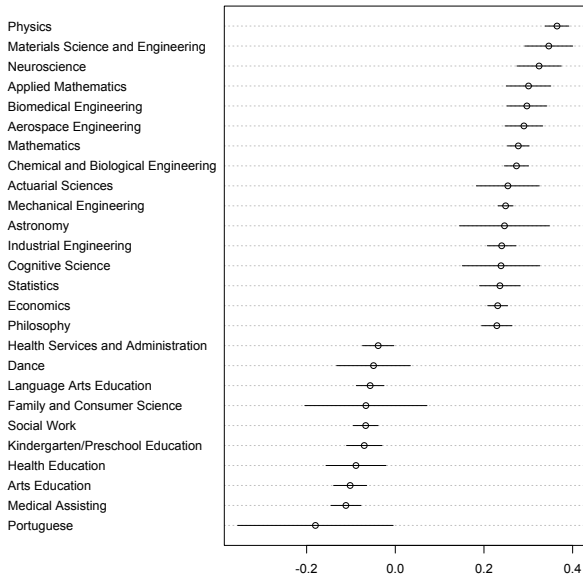
3D rotation by major





Extensions and applications of ICAR

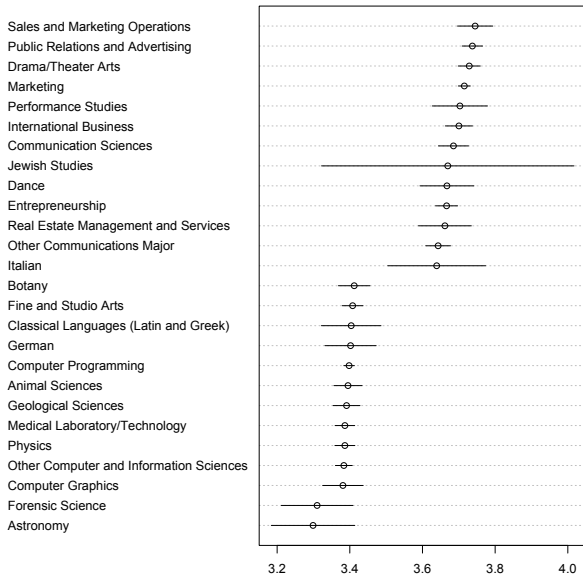
Matrix Reasoning by major





Extensions and applications of ICAR

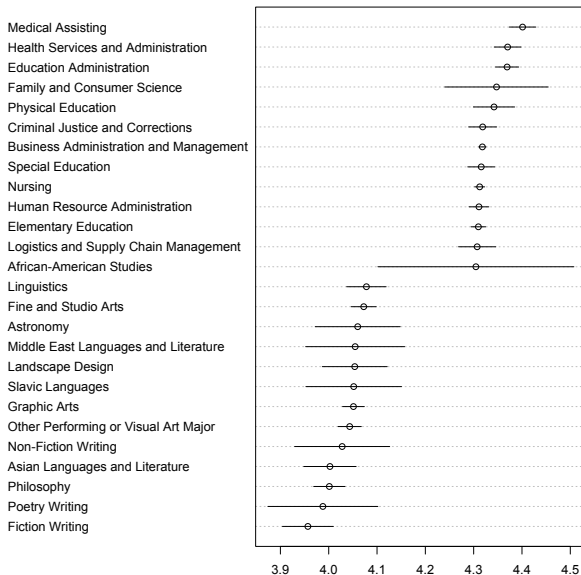
Extraversion by major





Extensions and applications of ICAR

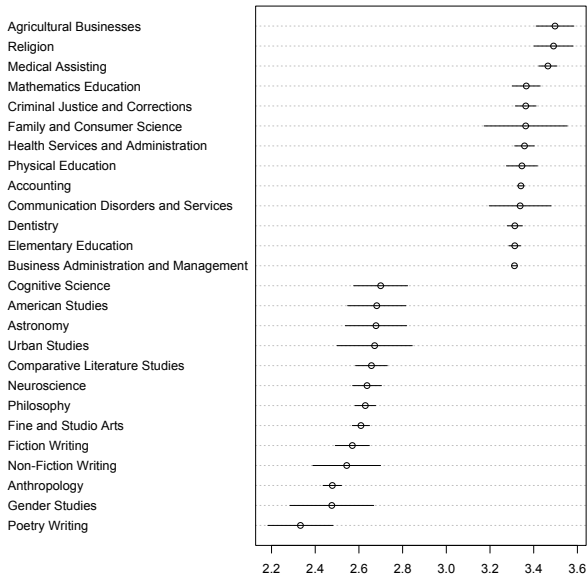
Conscientiousness by major





Extensions and applications of ICAR

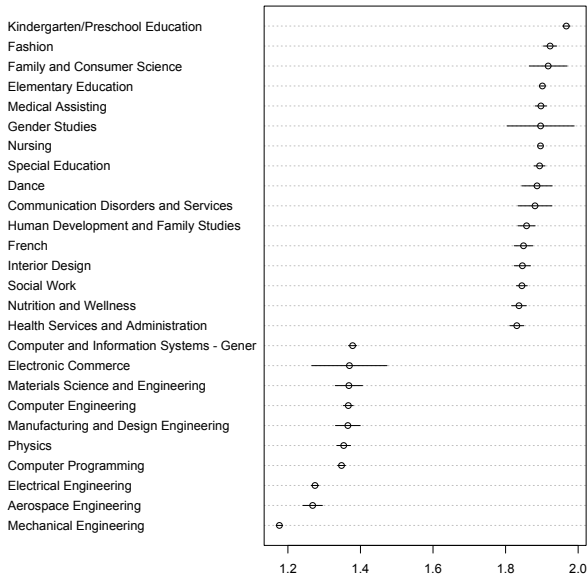
Conservatism by major





Extensions and applications of ICAR

Gender by major



The psych package for R

1. Although not technically limited to intelligence research, the development of the *psych* package for R was meant to supplement the open source nature of my research.
2. Partly driven by the need to handle SAPA type data and to validate the ICAR items, *psych* is meant as a Swiss Army Knife for data analysis.
 - That is, it is not the best tool for any problem.
 - But is a collection of pretty good tools for data analysis in general and psychometrics in general.
3. *psych* has been under development for the past 20 years and has a new update at least semi-annually.
 - These updates contain the inevitable bug fixes (from bugs reported by users).
 - More importantly, the updates include new functions that I have developed to further my (or my students') research.

Particularly useful psych functions

1. Although we all have our favorite functions, of the > 500 in *psych* the ones most useful for ability research include:
 - describe* Descriptive statistics
 - statsBy* Basic multilevel statistics by group.
 - fa* For conventional factor analysis.
 - irt.fa* To do 2PL IRT based upon the factor analysis of polychoric or tetrachoric correlations.
 - scoreOverlap* To find the correlations between scales with overlapping items.
2. Several vignettes describe the use of *psych* in more detail.
 - scoring scales, finding ω , factor analysis and its alternatives, mediation analysis. etc.

The secrets of a lifetime career award

1. Good luck
2. Great mentors
3. Great colleagues
4. Great students
5. Live long enough
6. Good luck

Slides available at <https://personality-project.org/sapa>

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