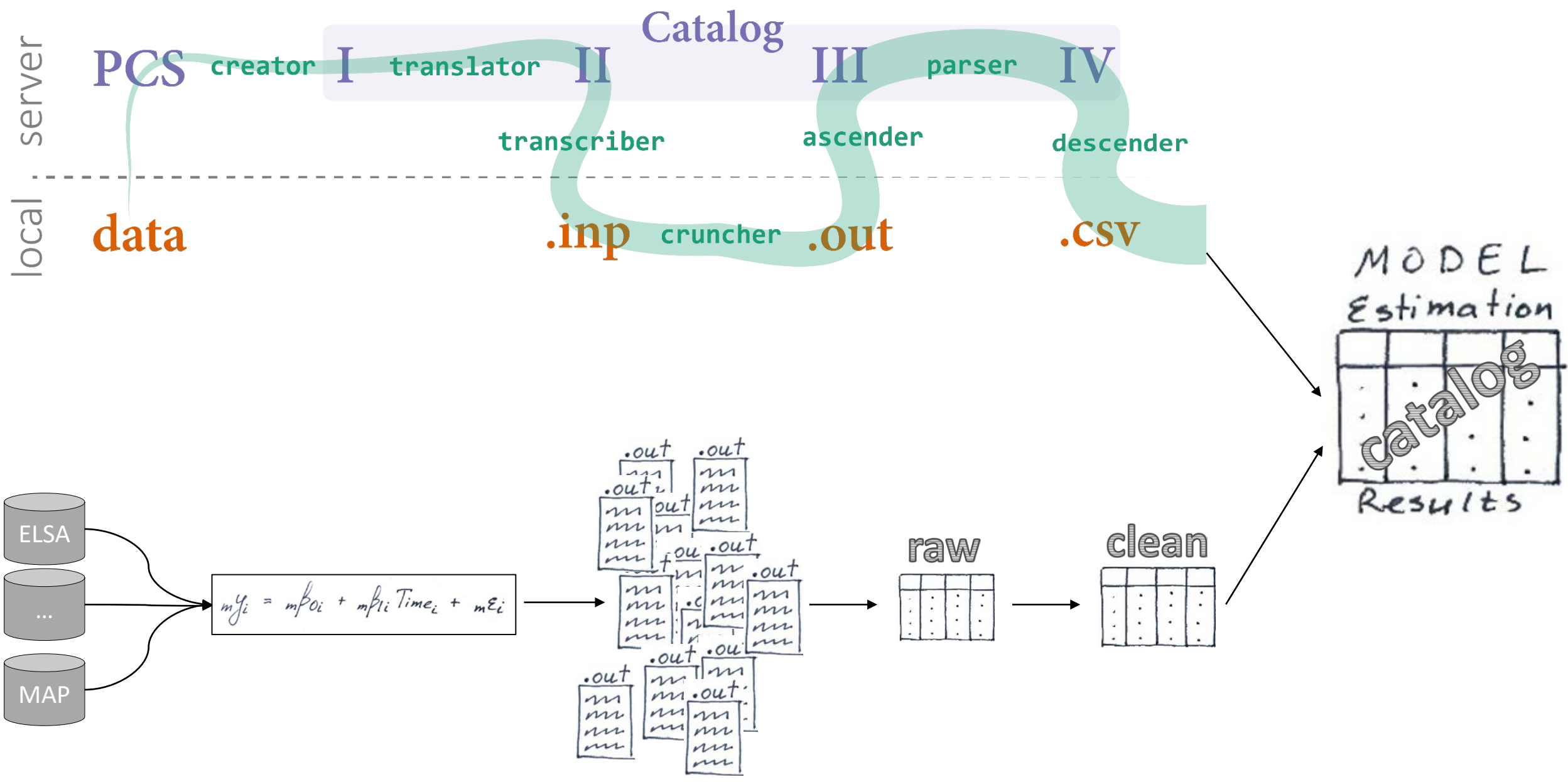


Portland : Analytic Strategy

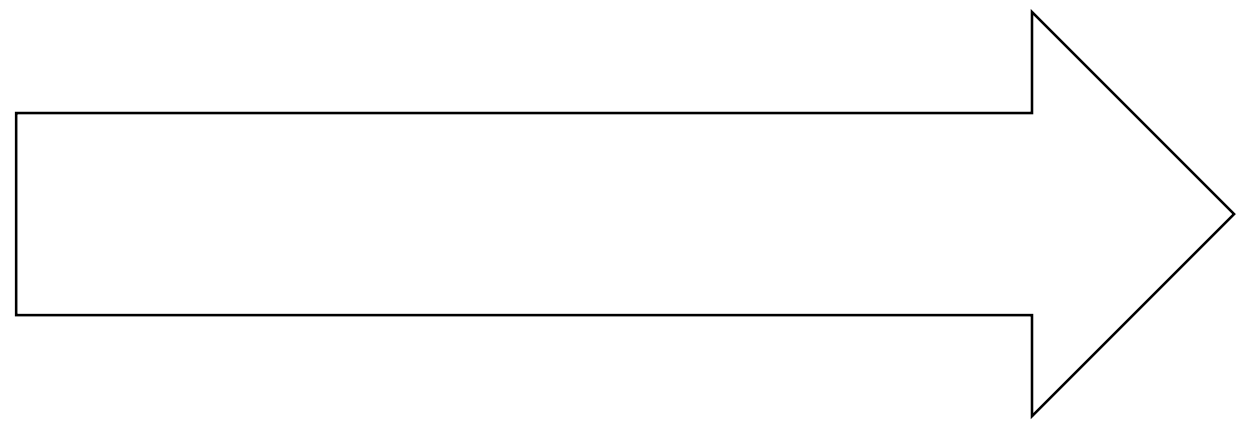
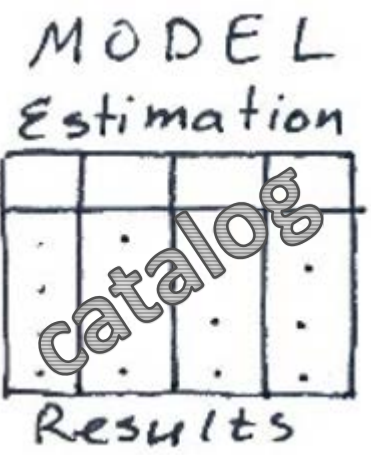
Brainstorming session

2016-08-30

Primary Phase



Secondary Phase



Manuscript

Tables

Graphs

```
> t <- table(ds$process_a, ds$study_name); t[t==0]<-"."; t
```

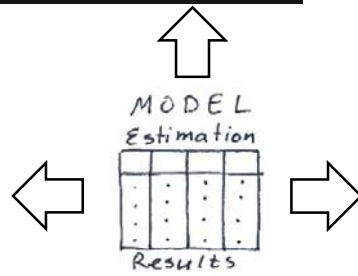
	eas	elsa	hrs	ilse	lasa	map	nuage	octo	satsa
fev	.	6	.	.	.	150	.	.	110
fev100	.	6
gait	110	8	30	.	6	.	.	9	.
grip	109	6	30	10	6	149	12	80	52
pef	36	.	30	.	6	.	.	54	.
tug	.	.	.	35

```
> t <- table(ds$process_b_row, ds$study_name); t[t==0]<-"."; t
```

	eas	elsa	hrs	ilse	lasa	map	nuage	octo	satsa
analogies	18
auditory comprehension	16	.	.	.
block design	27	.	.	6	.	.	.	18	12
boston naming test	20	15	.	.	.
categories	20	17	.	.	.
digit ordering	16	.	.	.
digit span backward	16	.	18	14
digit span forward	16	.	18	14
digit span total	29
f-a-s phonemic words	21
figure identification	12
figure logic	12	.
figure memory	10
fluency	.	2	.	7
information	20	.	.	8	.	.	.	8	18
IPSS spatial ability	.	.	.	8
line orientation	16	.	.	.
logical memory delayed	16	.	.	.
logical memory immediate	15	.	.	.
matrices	6	16	.	.	.
memory in reality	12	.
mini mental state exam	20	15	12	8	18
number comparison	15	.	.	.
perceptual speed	8	.
picture completion	.	.	.	8
prose recall delayed	16	.	.	.
prose recall immediate	16	.	17	.
prose recall total	19
reading	15	.	.	.
rotations	10
serial7	.	.	18
substitution	30	.	.	8	6	16	.	16	18
switching	29
synonyms	8	18
tics	.	.	18
vocabulary	20
word list delayed	.	16	36	.	.	16	.	.	.
word list immediate	.	8	18	.	6	16	.	.	.
word list recognition	15	.	.	.

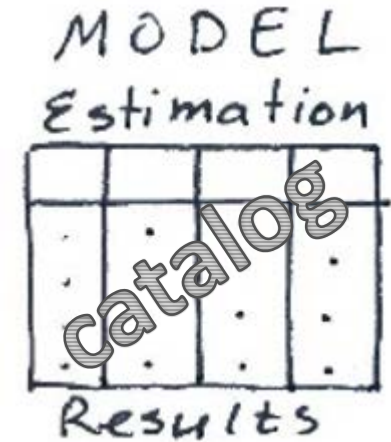
```
> t <- table(ds$process_b_row, ds$process_a); t[t==0]<-"."; t
```

	fev	fev100	gait	grip	pef	tug
analogies	10	.	.	8	.	.
auditory comprehension	8	.	.	8	.	.
block design	10	.	12	22	13	6
boston naming test	8	.	10	17	.	.
categories	8	.	10	19	.	.
digit ordering	8	.	.	8	.	.
digit span backward	20	.	2	20	6	.
digit span forward	20	.	2	20	6	.
digit span total	.	.	10	10	9	.
f-a-s phonemic words	.	.	10	10	1	.
figure identification	6	.	.	6	.	.
figure logic	.	.	.	8	4	.
figure memory	10
fluency	.	.	2	2	.	5
information	10	.	10	24	4	6
IPSS spatial ability	.	.	.	2	.	6
line orientation	8	.	.	8	.	.
logical memory delayed	8	.	.	8	.	.
logical memory immediate	7	.	.	8	.	.
matrices	8	.	2	10	2	.
memory in reality	.	.	.	8	4	.
mini mental state exam	17	.	10	42	4	.
number comparison	8	.	.	7	.	.
perceptual speed	.	.	.	4	4	.
picture completion	.	.	.	2	.	6
prose recall delayed	8	.	.	8	.	.
prose recall immediate	8	.	1	18	6	.
prose recall total	.	.	10	9	.	.
reading	8	.	.	7	.	.
rotations	10
serial7	.	.	6	6	6	.
substitution	18	.	14	38	18	6
switching	.	.	10	10	9	.
synonyms	10	.	.	12	4	.
tics	.	.	6	6	6	.
vocabulary	.	.	10	10	.	.
word list delayed	12	4	16	24	12	.
word list immediate	10	2	10	18	8	.
word list recognition	8	.	.	7	.	.



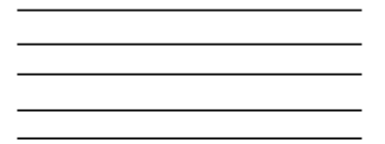
Secondary Phase

Currently available Tools for
Examining the Results



1. Domain Map
2. Single Model
3. Growth Curve
4. Correlation

Manuscript



Tables

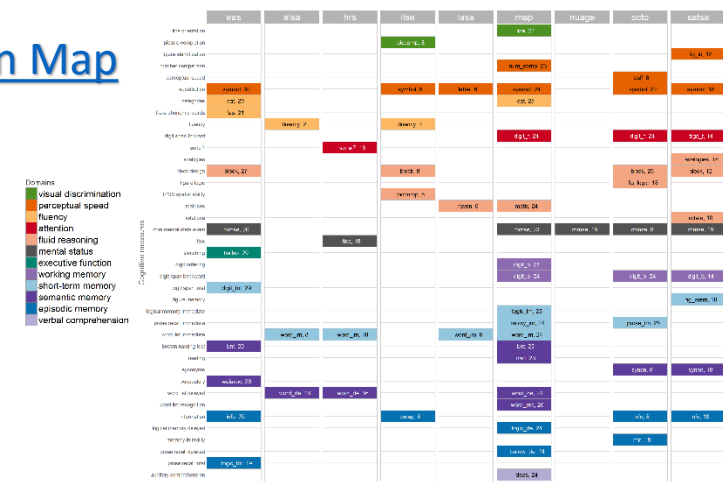
Graphs

Physical outcome = gait
 Model type = aehplus

Single Model

	type	process	label	est	se	pval
Fixed Effect	a	Intercept		106.988	12.919	0.000
Fixed Effect	a	Slope		-2.183	4.469	0.625
Fixed Effect	a	Intercept * age		-0.460	0.533	0.388
Fixed Effect	a	Intercept * education		0.659	0.914	0.471
Fixed Effect	a	Intercept * height		0.001	0.487	0.998
Fixed Effect	a	Intercept * smoking		-1.267	7.508	0.866
Fixed Effect	a	Intercept * cardio		-4.787	12.488	0.701
Fixed Effect	a	Intercept * diabetes		-5.230	8.237	0.525
Fixed Effect	a	Slope * age		-0.108	0.185	0.560
Fixed Effect	a	Slope * education		-0.264	0.241	0.273
Fixed Effect	a	Slope * height		0.067	0.173	0.696
Fixed Effect	a	Slope * smoking		0.816	2.232	0.715
Fixed Effect	a	Slope * cardio		1.574	3.039	0.604
Fixed Effect	a	Slope * diabetes		0.286	2.796	0.919
Fixed Effect	b	Intercept		23.860	7.142	0.001
Fixed Effect	b	Slope		1.745	1.404	0.214
Fixed Effect	b	Intercept * age		0.254	0.382	0.507
Fixed Effect	b	Intercept * education		0.575	0.550	0.295
Fixed Effect	b	Intercept * height		0.035	0.231	0.880
Fixed Effect	b	Intercept * smoking		-3.900	3.612	0.280
Fixed Effect	b	Intercept * cardio		0.465	4.778	0.922
Fixed Effect	b	Intercept * diabetes		-3.874	3.336	0.246
Fixed Effect	b	Slope * age		-0.086	0.078	0.269
Fixed Effect	b	Slope * education		-0.082	0.107	0.443
Fixed Effect	b	Slope * height		-0.031	0.053	0.550
Fixed Effect	b	Slope * smoking		0.186	0.768	0.809
Fixed Effect	b	Slope * cardio		0.115	1.708	0.946
Fixed Effect	b	Slope * diabetes		-0.359	0.921	0.697
Variance	aa	Intercept		212.461	121.942	0.081
Variance	aa	Slope		1.180	5.851	0.840
Variance		a Residual		74.196	17.458	0.000
Variance	bb	Intercept		41.498	20.299	0.041
Variance	bb	Slope		0.050	0.563	0.930
Variance		b Residual		23.585	2.355	0.000
Covariance	ab	Intercept(a) - Intercept(b)		27.135	36.191	0.453
Covariance	ab	Slope(a) - Slope(b)		0.037	1.692	0.983
Covariance	ab	Intercept(a) - Slope(b)		2.058	6.717	0.759
Covariance	ab	Slope(a) - Intercept(b)		-3.856	6.094	0.527
		N		72.000		
		AIC		3934.502		
		BIC		4027.846		

Domain Map



eas Correlation

Processes	Gender	n	$r_{intercepts}$	r_{slopes}	$r_{residuals}$
gait vs block	female	150	0.17(0.16), $p=.28$	0.02(0.67), $p=.98$	-0.07(0.08), $p=.36$
gait vs block	male	72	0.29(0.37), $p=.43$	0.15(7.19), $p=.98$	0.01(0.15), $p=.95$

eas Growth Curve

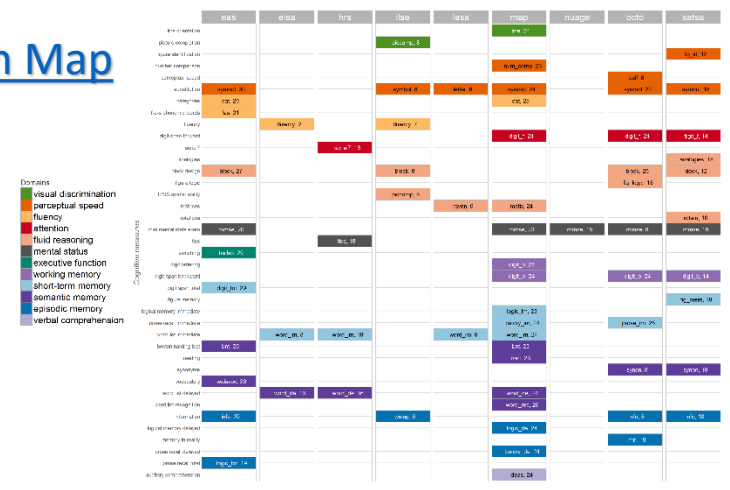
Process	Gender	n	species	intercept	slope
block	female	150	intercept	18.93(2.41), $p<.01$	0.80(0.47), $p=.09$
			age	-0.15(0.16), $p=.37$	-0.04(0.03), $p=.15$
			education	0.88(0.26), $p<.01$	-0.07(0.05), $p=.17$
			height	-0.01(0.11), $p=.91$	-0.01(0.02), $p=.66$
			smoking	1.53(1.44), $p=.29$	-0.10(0.26), $p=.69$
			cardio	-0.38(2.44), $p=.88$	-0.07(0.73), $p=.93$
block	male	72	intercept	24.09(7.14), $p<.01$	1.46(1.58), $p=.36$
			age	0.25(0.45), $p=.57$	-0.09(0.08), $p=.28$
			education	0.58(0.53), $p=.28$	-0.09(0.11), $p=.44$
			height	0.04(0.22), $p=.85$	-0.03(0.05), $p=.48$
			smoking	-3.94(3.47), $p=.26$	0.25(0.78), $p=.80$
			cardio	0.32(4.47), $p=.93$	0.22(1.57), $p=.89$
			diabetes	-3.76(3.99), $p=.35$	-0.42(1.11), $p=.71$

Physical outcome = gait
 Model type = aehplus

target process a : gait

	Fixed effects	animals	bnt	mmse	gait
a	intercept	18.93(2.41),**	18.93(2.41),**	18.93(2.41),**	18.93
a	slope	0.80(0.47)*	0.80(0.47)*	0.80(0.47)*	0.08
a	age	-0.15(0.16)**	-0.15(0.16)**	-0.15(0.16)**	-0.15
a	education	0.88(0.26)***	0.88(0.26)***	0.88(0.26)***	0.88
a	height	-0.01(0.11)	-0.01(0.11)	-0.01(0.11)	0
a	smoking	1.53(1.44)	1.53(1.44)	1.53(1.44)	1.15
a	cardio	-0.38(2.44)*	-0.38(2.44)*	-0.38(2.44)*	0
a	diabetes	-4.39(2.59)***	-4.39(2.59)***	-4.39(2.59)***	-4.39
a	slope*age	-0.04(0.03)**	-0.04(0.03)**	-0.04(0.03)**	-0.04
a	slope*education	-0.07(0.05)	-0.07(0.05)	-0.07(0.05)	0
a	slope*height	-0.01(0.02)	-0.01(0.02)	-0.01(0.02)	0
a	slope*smoking	-0.10(0.26)*	-0.10(0.26)*	-0.10(0.26)*	0
a	slope*cardio	-0.07(0.73)***	-0.07(0.73)***	-0.07(0.73)***	-0.07
a	slope*diabetes	0.18(0.40)	0.18(0.40)	0.18(0.40)	0.01
b	intercept	38.58(2.78)*	38.58(2.78)*	38.58(2.78)*	
b	slope	-0.78(0.72)***	-0.78(0.72)***	-0.78(0.72)***	
b	age	-0.35(0.19)***	-0.35(0.19)***	-0.35(0.19)***	
b	education	0.72(0.29)	0.72(0.29)	0.72(0.29)	
b	height	-0.10(0.14)	-0.10(0.14)	-0.10(0.14)	
b	smoking	0.78(1.34)	0.78(1.34)	0.78(1.34)	
b	cardio	1.06(3.11)	1.06(3.11)	1.06(3.11)	
b	diabetes	-5.08(2.30)**	-5.08(2.30)**	-5.08(2.30)**	
b	slope*age	-0.03(0.04)**	-0.03(0.04)**	-0.03(0.04)**	
b	slope*education	0.07(0.06)	0.07(0.06)	0.07(0.06)	
b	slope*height	0.00(0.03)	0.00(0.03)	0.00(0.03)	
b	slope*smoking	0.08(0.39)*	0.08(0.39)*	0.08(0.39)*	
b	slope*cardio	0.00(0.76)	0.00(0.76)	0.00(0.76)	
b	slope*diabetes	0.01(0.66)	0.01(0.66)	0.01(0.66)	
Variance components					
a	Intercept	6.13(.52)**	6.13(.52)**	6.13(.52)**	
a	Slope	.85(.12)*	.85(.12)*	.85(.12)*	
a	Residual	1.23(1.02)***	1.23(1.02)***	1.23(1.02)***	
b	Intercept	3.34(.52)***	3.34(.52)***	3.34(.52)***	
b	Slope	.66(.08)*	.66(.08)*	.66(.08)*	
b	Residual	2.08(.82)*	2.08(.82)*	2.08(.82)*	
Covariance Components					
	Cov(IPhys-ICog)	0.076(.051)	0.076(.051)	0.076(.051)	
	Cov(SPhys-SCog)	0.076(.051)	0.076(.051)	0.076(.051)	
	Cov(IPhys-SCog)	0.076(.051)	0.076(.051)	0.076(.051)	
	Cov(ICog-SPhys)	0.076(.051)	0.076(.051)	0.076(.051)	
	AIC	44259.46	44259.46	44259.46	
	BIC	44345.68	44345.68	44345.68	

Domain Map



eas Correlation

Processes	Gender	n	r intercepts	r slopes	r residuals
gait vs block	female	150	0.17(0.16), p=.28	0.02(0.67), p=.98	-0.07(0.08), p=.36
gait vs block	male	72	0.29(0.37), p=.43	0.15(7.19), p=.98	0.01(0.15), p=.95

eas Growth Curve

Process	Gender	n	species	intercept	slope
block	female	150	intercept	18.93(2.41), p<.01	0.80(0.47), p=.09
			age	-0.15(0.16), p=.37	-0.04(0.03), p=.15
			education	0.88(0.26), p<.01	-0.07(0.05), p=.17
			height	-0.01(0.11), p=.91	-0.01(0.02), p=.66
			smoking	1.53(1.44), p=.29	-0.10(0.26), p=.69
			cardio	-0.38(2.44), p=.88	-0.07(0.73), p=.93
block	male	72	intercept	24.09(7.14), p<.01	1.46(1.58), p=.36
			age	0.25(0.45), p=.57	-0.09(0.08), p=.28
			education	0.58(0.53), p=.28	-0.09(0.11), p=.44
			height	0.04(0.22), p=.85	-0.03(0.05), p=.48
			smoking	-3.94(3.47), p=.26	0.25(0.78), p=.80
			cardio	0.32(4.47), p=.93	0.22(1.57), p=.89
			diabetes	-3.76(3.99), p=.35	-0.42(1.11), p=.71

Modifications to the Domain Map

1) Replace cell values by

- Values of target index (R(slopes))
- Dense of target index

2) Alternate among physical outcomes

3) Highlight specific domains



	eas	elsa	hrs	ilse	lasa	map	nuage	octo	satsa
line orientation						line, 24			
picture completion				piccomp, 8					
figure identification									fig_id, 12
number comparison						num_comp, 23			
perceptual speed								psif, 8	
substitution	symbol, 30			symbol, 8	letter, 6	symbol, 24		symbol, 22	symbol, 18
categories	cat, 20					cat, 25			
f-a-s phonemic words	fas, 21								
fluency		fluency, 2		fluency, 7					
digit span forward						digit_f, 24		digit_f, 24	digit_f, 14
serial7			serial7, 18						
analogies									analogies, 18
block design	block, 27			block, 8				block, 26	block, 12
figure logic								fig_logic, 18	
IPSS spatial ability				piccomp, 8					
matrices					raven, 6	matix, 24			
rotations									rotate, 10
mini mental state exam	mmse, 20					mmse, 23	mmse, 18	mmse, 8	mmse, 18
tics			tics, 18						
switching	trailsb, 29								
digit ordering						digit_o, 24			
digit span backward						digit_b, 24		digit_b, 24	digit_b, 14
digit span total	digit_tot, 29								
figure memory									fig_mem, 10
logical memory immediate						logic_im, 23			
prose recall immediate						bstory_im, 24		prose_im, 25	
word list immediate		word_im, 8	word_im, 18		word_im, 6	word_im, 24			
boston naming test	bnt, 20					bnt, 23			
reading						nart, 23			
synonyms								synon, 8	synon, 18
vocabulary	waisvoc, 20								
word list delayed		word_de, 16	word_de, 36			word_de, 24			
word list recognition						word_rec, 20			
information	info, 20			waisg, 8				info, 8	info, 18
logical memory delayed						logic_de, 24			
memory in reality								mir, 18	
prose recall delayed						bstory_de, 24			
prose recall total	logic_tot, 19								
auditory comprehension						ideas, 24			


```
> t <- table(ds$process_b_row, ds$study_name); t[t==0]<-"."; t
```

	eas	elsa	hrs	ilse	lasa	map	nuage	octo	satsa
analogies	18
auditory comprehension	16	.	.	.
block design	27	.	.	6	.	.	.	18	12
boston naming test	20	15	.	.	.
categories	20	17	.	.	.
digit ordering	16	.	.	.
digit span backward	16	.	18	14
digit span forward	16	.	18	14
digit span total	29
f-a-s phonemic words	21
figure identification	12
figure logic	12	.
figure memory	10
fluency	.	2	.	7
information	20	.	.	8	.	.	.	8	18
IPSS spatial ability	.	.	.	8
line orientation	16	.	.	.
logical memory delayed	16	.	.	.
logical memory immediate	15	.	.	.
matrices	6	16	.	.	.
memory in reality	12	.
mini mental state exam	20	15	12	8	18
number comparison	15	.	.	.
perceptual speed	8	.
picture completion	.	.	.	8
prose recall delayed	16	.	.	.
prose recall immediate	16	.	17	.
prose recall total	19
reading	15	.	.	.
rotations	10
serial7	.	.	18
substitution	30	.	.	8	6	16	.	16	18
switching	29
synonyms	8	18
tics	.	.	18
vocabulary	20
word list delayed	.	16	36	.	.	16	.	.	.
word list immediate	.	8	18	.	6	16	.	.	.
word list recognition	15	.	.	.

```
, , = grip
```

	eas	elsa	hrs	ilse	lasa	map	nuage	octo	satsa
analogies	8
auditory comprehension	8	.	.	.
block design	10	10	2
boston naming test	10	7	.	.	.
categories	10	9	.	.	.
digit ordering	8	.	.	.
digit span backward	8	.	10	2
digit span forward	8	.	10	2
digit span total	10
f-a-s phonemic words	10
figure identification	6
figure logic	8	.
figure memory
fluency	.	.	.	2
information	10	.	.	2	.	.	.	4	8
IPSS spatial ability	.	.	.	2
line orientation	8	.	.	.
logical memory delayed	8	.	.	.
logical memory immediate	8	.	.	.
matrices	2	8	.	.	.
memory in reality	8	.
mini mental state exam	10	8	12	4	8
number comparison	7	.	.	.
perceptual speed	4	.
picture completion	.	.	.	2
prose recall delayed	8	.	.	.
prose recall immediate	8	.	10	.
prose recall total	9
reading	7	.	.	.
rotations
serial7	.	.	6
substitution	10	.	.	2	2	8	.	8	8
switching	10
synonyms	4	8
tics	.	.	6
vocabulary	10
word list delayed	.	4	12	.	.	8	.	.	.
word list immediate	.	2	6	.	2	8	.	.	.
word list recognition	7	.	.	.


```
t <- table(ds$process_a, ds$study_name); t[t==0]<-"."; t
```

	eas	elsa	hrs	ilse	lasa	map	nuage	octo	satsa
fev	.	6	.	.	.	150	.	.	110
fev100	.	6
gait	110	8	30	.	6	.	.	9	.
grip	109	6	30	10	6	149	12	80	52
pef	36	.	30	.	6	.	.	54	.
tug	.	.	.	35

35 x 3 = 105 unique models

pulmonary
OR
gait
OR
grip

Story of class A :
change in a physical outcome (e.g. grip)
is related to
change in a cognitive domain (e.g. short-term memory)
or **specific test** (e.g. prose recall)

digit span forward	attention
serial7	attention
information	episodic memory
logical memory delayed	episodic memory
memory in reality	episodic memory
prose recall delayed	episodic memory
prose recall total	episodic memory
switching	executive function
categories	fluency
f-a-s phonemic words	fluency
fluency	fluency
analogies	fluid reasoning
block design	fluid reasoning
figure logic	fluid reasoning
IPSS spatial ability	fluid reasoning
matrices	fluid reasoning
rotations	fluid reasoning
mini mental state exam	mental status
tics	mental status
figure identification	perceptual speed
number comparison	perceptual speed
perceptual speed	perceptual speed
substitution	perceptual speed
boston naming test	semantic memory
reading	semantic memory
synonyms	semantic memory
vocabulary	semantic memory
word list delayed	semantic memory
word list recognition	semantic memory
digit span total	short-term memory
figure memory	short-term memory
logical memory immediate	short-term memory
prose recall immediate	short-term memory
word list immediate	short-term memory
auditory comprehension	verbal comprehension
line orientation	visual discrimination
picture completion	visual discrimination
digit ordering	working memory
digit span backward	working memory

```
t <- table(ds$process_a, ds$study_name); t[t==0] <- "."; t
```

	eas	elsa	hrs	ilse	lasa	map	nuage	octo	satsa
fev	.	6	.	.	.	150	.	.	110
fev100	.	6
gait	110	8	30	.	6	.	.	9	.
grip	109	6	30	10	6	149	12	80	52
pef	36	.	30	.	6	.	.	54	.
tug	.	.	.	35

35 x 3 = 105 unique models

pulmonary
OR
gait
OR
grip



Story of class A :
change in a physical outcome (e.g. grip)
is related to
change in a **cognitive domain** (e.g. short-term memory)
or specific test (e.g. prose recall)

mmse
tics

```
> t <- table(ds$process_a, ds$study_name); t[t==0]<-"."; t
```

	eas	elsa	hrs	ilse	lasa	map	nuage	octo	satsa
fev	.	6	.	.	.	150	.	.	110
fev100	.	6
gait	110	8	30	.	6	.	.	9	.
grip	109	6	30	10	6	149	12	80	52
pef	36	.	30	.	6	.	.	54	.
tug	.	.	.	35

Story of class B :

performance in a cognitive domain (e.g. fluid reasoning)
is sensitive to
changes in a physical function (e.g. gait)

Check points for individual model evaluation

- Significant pc TAU 11
- Significant pc R 11
- Sufficient pp TAU 11
- Sample size < threshold
- ?
- ?
- ?

$$\begin{aligned}
 {}_{o=\text{Physical}}\beta_{0i} &= {}_p\gamma_{00} + {}_p\Gamma_{0k}(\text{CovSet}) + {}_p\mathbf{u}_{0i} \\
 {}_{o=\text{Physical}}\beta_{1i} &= {}_p\gamma_{10} + {}_p\Gamma_{1k}(\text{CovSet}) + {}_p\mathbf{u}_{1i} \\
 {}_o y_{ti} &= {}_o\beta_{0i} + {}_o\beta_{1i}(\text{Time}_{ti}) + {}_o\boldsymbol{\varepsilon}_{ti} \\
 {}_{o=\text{Cognitive}}\beta_{1i} &= {}_c\gamma_{10} + {}_c\Gamma_{1k}(\text{CovSet}) + {}_c\mathbf{u}_{1i} \\
 {}_{o=\text{Cognitive}}\beta_{0i} &= {}_c\gamma_{00} + {}_c\Gamma_{0k}(\text{CovSet}) + {}_c\mathbf{u}_{0i}
 \end{aligned}$$

	Fixed Effects	Random Effects	Residuals
Physical Intercept	${}_p\gamma_{00}$ ${}_p\gamma_{01}$ ${}_p\gamma_{02}$ \dots ${}_p\gamma_{0k}$	${}_{pp}\tau_{00}$ ${}_{pp}\tau_{01}$ ${}_{pc}\tau_{01}$ ${}_{pc}\tau_{00}$	${}_p\sigma$
Physical Slope	${}_p\gamma_{10}$ ${}_p\gamma_{11}$ ${}_p\gamma_{12}$ \dots ${}_p\gamma_{1k}$	${}_{pp}\tau_{11}$ ${}_{pc}\tau_{11}$ ${}_{pc}\tau_{10}$	
Cognitive Slope	${}_c\gamma_{10}$ ${}_c\gamma_{11}$ ${}_c\gamma_{12}$ \dots ${}_c\gamma_{1k}$	${}_{cc}\tau_{11}$ ${}_{cc}\tau_{10}$	${}_c\sigma$
Cognitive Intercept	${}_c\gamma_{00}$ ${}_c\gamma_{01}$ ${}_c\gamma_{02}$ \dots ${}_c\gamma_{0k}$	${}_{cc}\tau_{00}$	

Check points for domain evaluation