# Estimating the contribution of new neurons to behaviour using Bayesian graphical models

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# Adult hippocampal neurogenesis



"Once the development was ended, the founts of growth and regeneration of the axons and dendrites dried up irrevocably. Everything may die, nothing may be regenerated." -S. Ramón y Cajal

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http://www4.utsouthwestern.edu/HsiehLab/

# Graphical models



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## Are other mechanisms at work?

Affects neurogenesis	Off-target effects
Exercise	Spine density Synaptic proteins Glutamate receptors
Stress/Corticosterone	Dendrites/spines GR/MR expression
Environmental Enrichment	Dendrites/spines BDNF
MAM	General health Locomotor activity
Imipramine	Dendrites/synapses
Fluoxetine	Dendrites/spines
Irradiation	NMDA receptors Inflammation/vasculature DNA damage

#### Age and spatial memory



## Age and spatial memory



Number of proliferating cells (x1000)

Hassler & Thadewald (2003) Nonsensical and biased correlation due to pooling heterogeneous samples. J R Stat Soc: Series D 52:367.

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#### Systematic review and meta-analysis



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PMID	Species	Condition	Behavioural test
24582851	Rat (Wistar)	CB1 agonist	MWM
20133882	Mouse (C57BL/6)	Exercise	Pattern separation
23567812	Rat (Wistar)	Ethanol	OF/Locomotion
19452518	Mouse (C57BL/6)	Exercise	OF/ LDB
11005874	Rat (SD)	Stress	MWM
20875841	Mouse (C57BL/6)	Enrichment	FST
12640670	Rat (F344)	Age	MWM
19100662	Rat (DA)	Age	MWM (latency)
17587610	Canine	Antiox + Enrich	Reversal + spatial errors
22795793	Rat (F344)	Enrichment	MWM
23078985	Rat (F344)	Exercise	MWM
23643842	Mouse (C57BL/6)	Down's + Choline	MWM

#### Meta-analysis: effect of other mechanisms



PMID	Species	Condition	Test	Histology	n		
24582851	Rat (Wistar)	CB1 agonist	MWM	DCX	9		·
20133882	Mouse (C57BL/6)	Exercise	Pat sep	BrdU/NeuN	20		·
23567812	Rat (Wistar)	Ethanol	OF (72 days)	DCX	17	+	•
23567812	Rat (Wistar)	Ethanol	OF (114 days)	DCX	23		•
11005874	Rat (SD)	Stress	MWM	BrdU	10		۱ <u>ـــــ</u> ۱
20875841	Mouse (C57BL/6)	Enrichment	FST	BrdU	19		•
12640670	Rat (F344)	Age	MWM	BrdU	32		•
19100662	Rat (DA)	Age	MWM	DCX	16		• • • • • • • • • • • • • • • • • • • •
17587610	Canine	Antiox+Enrich	B/W	BrdU/DCX	21		·
22795793	Rat (F344)	Enrichment	MWM	Multiple	16		•i
23078985	Rat (F344)	Exercise	MWM	Multiple	11		·
23643842	Mouse (C57BL/6)	Down's + Choline	MWM	DCX	21		·
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Overall estimate: (p < 0.0001)							-
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Standardised effect of other mechanisms

#### Meta-analysis: effect of neurogenesis



PMID	Species	Condition	Test	Histology	n	
24582851	Rat (Wistar)	CB1 agonist	MWM	DCX	9	↓
20133882	Mouse (C57BL/6)	Exercise	Pat sep	BrdU/NeuN	20	⊢I
23567812	Rat (Wistar)	Ethanol	OF (72 days)	DCX	17	<b>⊢</b>
23567812	Rat (Wistar)	Ethanol	OF (114 days)	DCX	23	<b>↓</b>
11005874	Rat (SD)	Stress	MWM	BrdU	10	⊧i
20875841	Mouse (C57BL/6)	Enrichment	FST	BrdU	19	·
12640670	Rat (F344)	Age	MWM	BrdU	32	·
19100662	Rat (DA)	Age	MWM	DCX	16	·
17587610	Canine	Antiox+Enrich	B/W	BrdU/DCX	21	<b></b> I
22795793	Rat (F344)	Enrichment	MWM	Multiple	16	<b>⊢</b>
23078985	Rat (F344)	Exercise	MWM	Multiple	11	·
23643842	Mouse (C57BL/6)	Down's + Choline	MWM	DCX	21	<b></b>
Overall estimate: (p = 0.128)						-



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#### A more complex experiment

Condition	Neurogenesis	Behaviour
Control	Baseline	Baseline

#### A more complex experiment

Condition	Neurogenesis	Behaviour
Control	Baseline	Baseline
Exercise	Ť	Ť

#### A more complex experiment

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Condition	Neurogenesis	Behaviour
Control	Baseline	Baseline
Exercise	1	Ť
Exercise + CORT	$\leftrightarrow$	$\leftrightarrow$

## A more complex experiment: simulation study



## A more complex experiment: simulation study



## More complex experiments



Neurogenesis

#### More complex experiments



Neurogenesis

- Graphical models are useful to describe and test relationships in the data.
- Most studies provide no evidence for a causal neurogenesis behaviour relationship because of
  - 1. inferential leaps that are unsupported by the data, and
  - 2. other mechanisms that are known to exist and can explain the results.
- Data underlying conclusions are unavailable.
- Neurogenesis has limited involvement in behaviour.

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#### References

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