



# Resting-State Functional Connectivity for Prevention Researchers: What, Why, and How?



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# Presentation Outline

## Informational Content

- ❑ What is Resting-State Functional Connectivity (rsFC)?
- ❑ Why is rsFC relevant for prevention research?
- ❑ How is it measured?
- ❑ Common Functional Networks
  
- ❑ Questions?

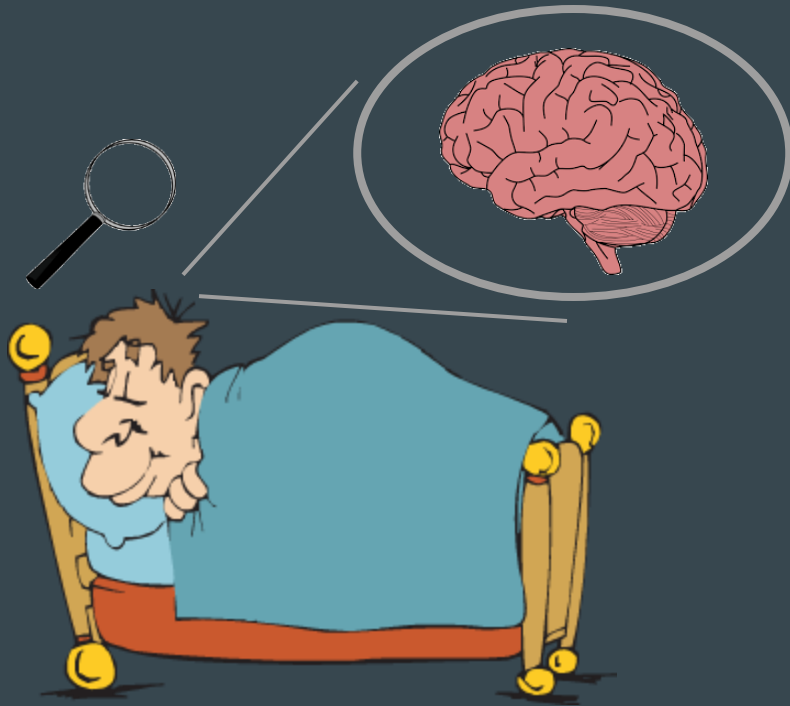
## Hands-on Activity

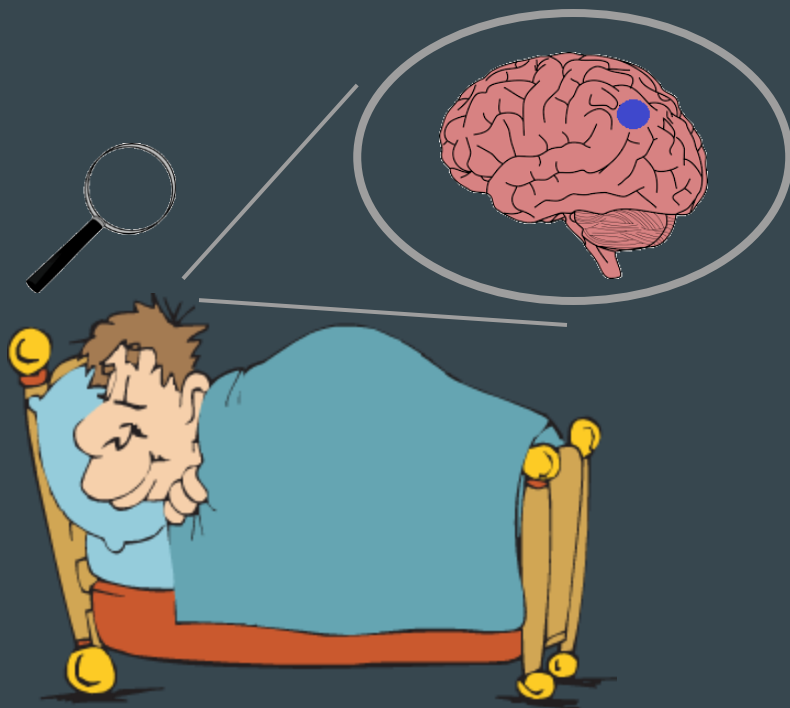
- ❑ Quantifying the brain at rest: rsFC of the Executive-Control Network

# What is Resting-State Functional Connectivity (rsFC)?

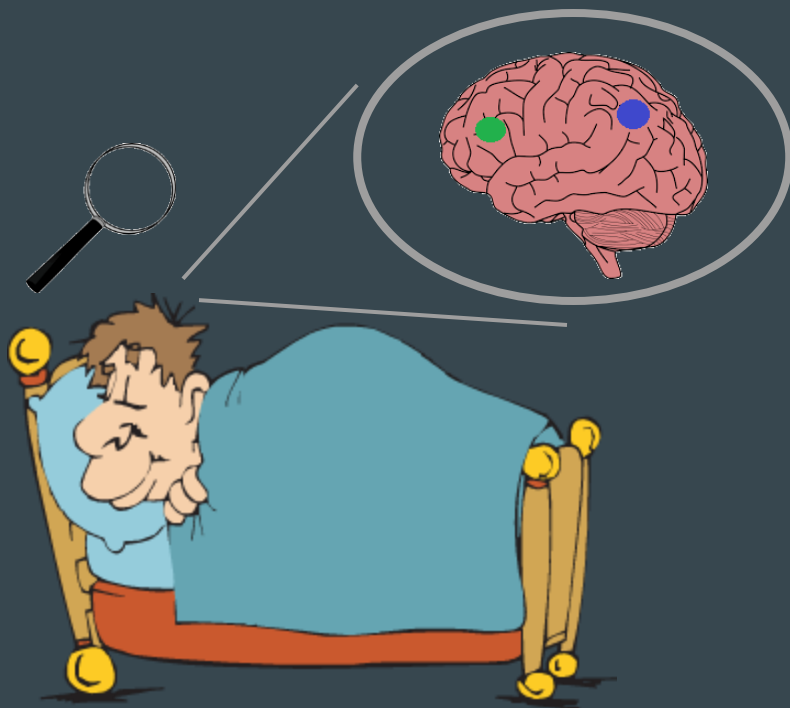
Correlation in neural activity between two or more brain regions, measured while participants are “at rest”.





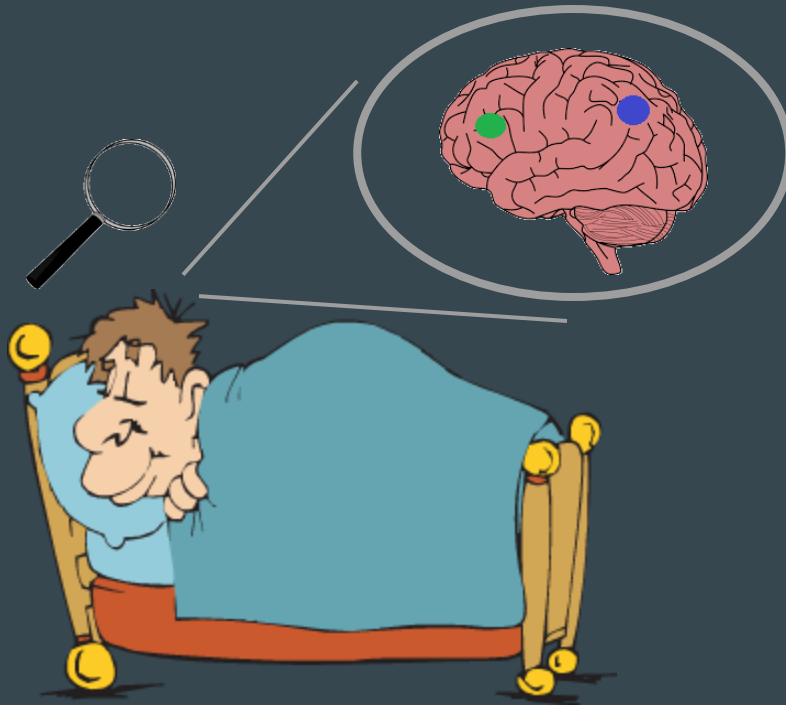


-18121.9  
-38890.2  
-13458.4  
40374.2  
53140.9  
7176.48  
-33219.7  
-17254.5  
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$$r = \frac{\sum xy}{\sqrt{\sum x^2 \sum y^2}}$$



# What is Resting-State Functional Connectivity (rsFC)?

Correlation in neural activity between two or more brain regions, measured while participants are “at rest”.

- ❑ Spontaneous activation. Random. Error term in regression model.

$$Y = \beta_0 + \beta_1 X_1 + \beta_2 X_2 + \beta_3 X_3 + \varepsilon$$

$Y =$  $\varepsilon$

# What is Resting-State Functional Connectivity (rsFC)?

Correlation in neural activity between two or more brain regions, measured while participants are “at rest”.

- ❑ Spontaneous activation. Random. Error term in regression model.
- ❑ If random, then correlation = 0.
- ❑ Correlation thought to reflect extent of interconnected functioning.

Seminal Contribution: Rather than operate independently, brain regions form a series of neural networks that interact to achieve advanced human cognition.

- ❑ Fundamental organization of the human brain.
- ❑ Neural underpinnings of complex behavior (i.e. self-regulation, decision making).

# Why is rsFC important in general?

- ❑ Allows brain to be observed without anyone looking/task interference.
- ❑ Reveals “true” extent of network based activity.
- ❑ Are brain regions primarily independent or part of a team (i.e. network)?
- ❑ What networks exist/how function?
- ❑ Investigate development/cortical maturity (density/homogeneity/heterogeneity).
- ❑ Understand how the brain actually achieves higher order behaviors.
- ❑ Individ Connections or aggregates across network?
- ❑ Do group or individual differences in rsFC predict behavior?
- ❑ Prediction of group assignment.

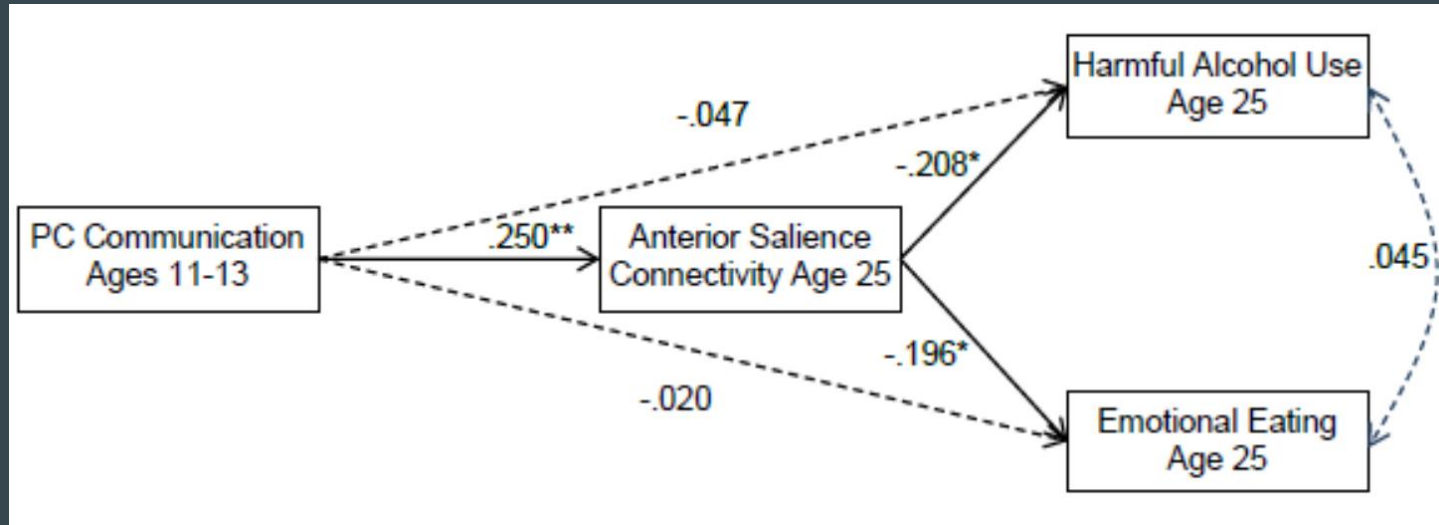
# Why is rsFC relevant for prevention research?

- ❑ Improve model fit
  - ❑ Important brain-behavior relationships missing from earlier research.
  - ❑ Outcome measures or predictors of outcomes.
  - ❑ Mediation of established predictor-outcome relationships. (ex: Parenting on Risk-taking)
  
- ❑ Deeper understanding of how:
  - ❑ Risk and/or Protective factors affect the brain (cortical maturity, premature aging)
  - ❑ Prevention efforts affect the brain.
  - ❑ Prevention efforts ameliorate behavior by altering the brain.

# Holmes et al. (in press)

- ❑ Strong African American Families Healthy Adult Project
  - ❑ Longitudinal, multimethod; Ages 11-adulthood.
- ❑ N=91 (52% female; N=119 before motion and technical exclusions).
- ❑ All aged 25 at time of rsFC scan.
  
- ❑ Influence of parenting (ages 11-13) on rsFC of the Anterior Salience Network (ASN) at age 25.
- ❑ Influence of ASN rsFC on Harmful Alcohol Use and Emotional Eating at age 25.
  - ❑ Alcohol Use Disorders Identification Test (Saunders et al., 1993).
  - ❑ Emotional Eating Scale (Arnow et al., 1995)

# Holmes et al. (in press)



- Parent-child communication at ages 11-13 predicted rsFC of the Anterior Salience Network at age 25.
- ASN connectivity at age 25 predicted two maladaptive behaviors independently.



# How is rsFC measured?



“rest in 3..2..1..”

- ❑ Length of scan varies; need min four minutes usable data. (get more!)
- ❑ “Timeseries” for each voxel (series of data points reflecting activation across time; one data point per TR).

# How is rsFC measured?



```
3017.41  
-18121.9  
-38890.2  
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-45196.2  
9455.49  
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40451.2  
17058.1  
13545  
20182.1  
6450.8  
-24755.9
```

# How is rsFC measured?

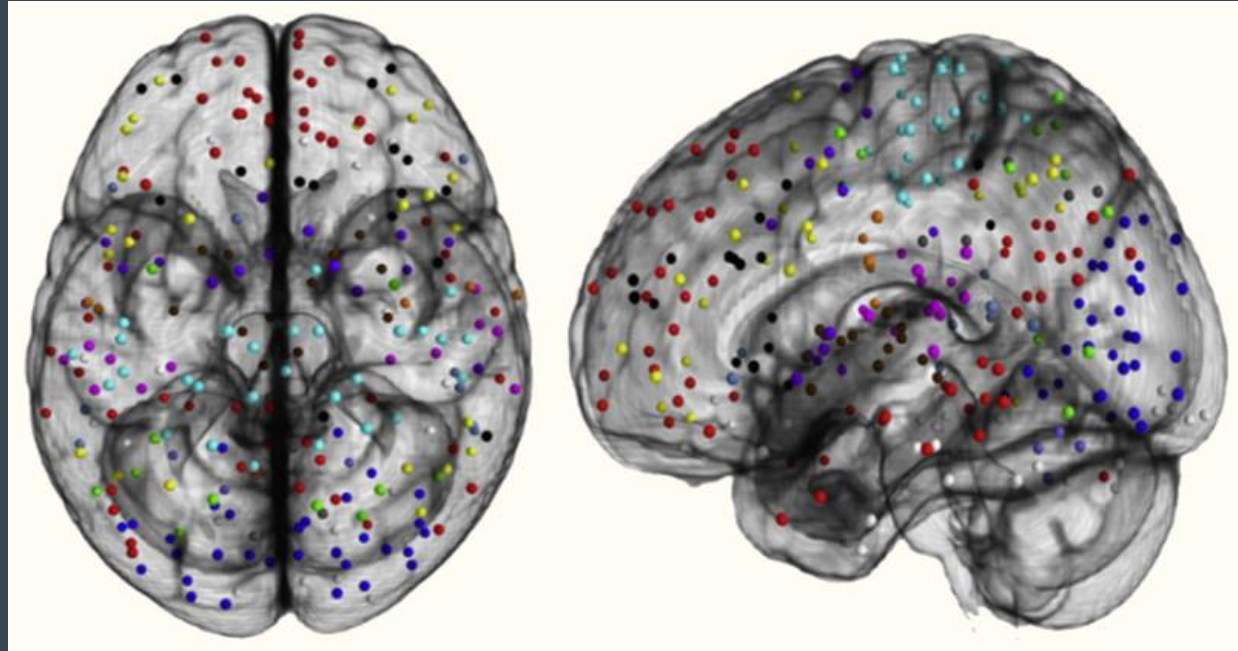
- ❑ Creates a 2D matrix for each subject: Voxel X Time.
- ❑ Issue!: Raw values from scanner are arbitrary
  - ❑ Percent signal change calculated first, then correlations
    - ❑  $p = ((a - m_a)/m_a)100$
- ❑ Then z-scores (using Fischer's r to z transform)
  - ❑  $z = \log((1+r)/(1-r))/2$
  - ❑ Analyses conducted on z-score dataset.

# How is rsFC measured?

- ❑ Independent Components Analysis sometimes used to identify networks.
  - ❑ Data-driven approach. Makes little/no a-priori assumptions.
- ❑ Seed-based: one Region of Interest (ROI) and rest of brain.
  - ❑ Often based on significant activation during task performance.
- ❑ ROI-ROI
  - ❑ Hypothesis testing based on previous literature.
  - ❑ Single or multiple (i.e. network) connections.
  - ❑ Allows “graph theory” approach.

# Common Functional Networks

- Somatomotor/Hand
- Somatomotor/Mouth
- Cingulo-Opercular Control
- Auditory
- Default Mode
- Memory Retrieval
- Visual
- Fronto-parietal Control
- Salience
- Subcortical
- Ventral Attention
- Dorsal Attention
- Cerebellar



(Satterthwaite et al., 2013)

# Common Functional Networks

- ❑ Default Mode Network (DMN): PCC, mPFC, IPL
  - ❑ Active when task not present.
  - ❑ Associated with disengagement and internal/subjective thought processes.
- ❑ Executive-Control Network (EC): IPL(IPS), dlPFC
  - ❑ Active when completing a task.
  - ❑ Associated with task engagement, external thought processes, and cognitive control.
- ❑ Salience Network (SN): dACC and aI
  - ❑ Activates as stimuli are more salient.
  - ❑ Involved in switching activation between the EC and DMN.
- ❑ Ventral Valuation & Dorsal Control Networks (VS/DS): Striatum based
  - ❑ Active when processing option value (VS) or controlling for appropriate responses (DS)

# Questions?

# Activity: Quantifying Network Level rsFC (one way)

## ❑ Four easy steps:

1. Determine which networks you want to study (theory; research question).
2. Determine how you want to define your networks (previous lit; current findings; both).
3. Correlate neural activity between all possible connections for each subject.
  - 3.1 Convert correlations to Z-scores using Fisher's  $r$  to  $z$  transform.
  - 3.2 "Vectorize" results.
  - 3.3 Add row to dataset containing all participants.
4. Calculate average of all connections within each network (and between).

## ❑ Conduct t-test to compare mean values against 0, correcting as needed.



# Activity: Quantifying Network Level rsFC (one way)

□ Fair (2009):

Regions of Interest (ROI)	ROI Abbreviations	Coordinates			Functional Network
		x	y	z	
dorsolateral prefrontal cortex	dIPFC	-43	22	34	Fronto_Parietal
dorsolateral prefrontal cortex	dIPFC	43	22	34	Fronto_Parietal
Frontal	frontal	-41	3	36	Fronto_Parietal
Frontal	frontal	41	3	36	Fronto_Parietal
mid cingulate cortex	mCC	0	-29	30	Fronto_Parietal
inferior parietal lobule	IPL	-51	-51	36	Fronto_Parietal
inferior parietal lobule	IPL	51	-47	42	Fronto_Parietal
intraparietal sulcus	IPS	-31	-59	42	Fronto_Parietal
intraparietal sulcus	IPS	30	-61	39	Fronto_Parietal
Precuneus	Precun	-9	-72	37	Fronto_Parietal
Precuneus	Precun	10	-69	39	Fronto_Parietal
anterior Prefrontal Cortex	aPFC	-28	51	15	Cingulo_Opercular
anterior Prefrontal Cortex	aPFC	27	50	23	Cingulo_Opercular
anterior insula/frontal operculum	al/IO	-35	14	5	Cingulo_Opercular
anterior insula/frontal operculum	al/IO	36	16	4	Cingulo_Opercular
dorsal anterior cingulate/medial superior frontal cortex	dACC/msFC	-1	10	46	Cingulo_Opercular
superior frontal cortex	ant thal	-12	-15	7	Cingulo_Opercular
anterior thalamus	ant thal	10	-15	8	Cingulo_Opercular
anterior thalamus	amPFC	1	54	21	Default
ventromedial prefrontal cortex	vmPFC	-3	39	-2	Default
superior frontal cortex	sup frontal	-14	38	52	Default
superior frontal cortex	sup frontal	17	37	52	Default
inferior temporal	inf templ	-61	-33	-15	Default
inferior temporal	inf templ	65	-17	-15	Default
parahippocampal	parahippo	-22	-26	-16	Default
parahippocampal	parahippo	25	-26	-14	Default
posterior cingulate cortex	pCC	-2	-36	37	Default
lateral parietal	latP	-47	-67	36	Default
lateral parietal	latP	53	-67	36	Default
retro splenial	retro splen	3	-51	8	Default

# Activity: Quantifying Network Level rsFC (one way)

□ Anderson (2011):

<i>Default mode network</i>		<i>Attention control network</i>	
<i>Hub</i>	<i>MNI coordinates</i>	<i>Hub</i>	<i>MNI coordinates</i>
Left posterior cingulate	-4-52 32	Left intraparietal sulcus	-43-38 46
Right posterior cingulate	4-53 35	Right intraparietal sulcus	40-39 51
Left medial prefrontal	-2 55-13	left frontal eye field	-21-4 59
Right medial prefrontal	2 55-13	Right frontal eye field	27-6 54
Left temporoparietal junction	-49-62 34	Left anterior insula	-38 14 8
Right temporoparietal junction	50-57 36	Right anterior insula	40 15 8

# Activity: Quantifying Network Level rsFC (one way)

□ Fair (2009):

-43	22	34	dLPFC-432234
43	22	34	dLPFC432234
-41	03	36	Front-410336
41	03	36	Front410336
00	-29	30	mCC00-2930
-51	-51	36	IPL-51-5136
51	-47	42	IPL51-4742
-31	-59	42	IPS-31-5942
30	-61	39	IPS30-6139
-09	-72	37	PREC-09-7237
10	-69	39	PREC10-6939
01	54	21	amPFC015421
-03	39	-02	vmPFC-0339-02
-14	38	52	SupFr-143852
17	37	52	SupFr173752
-61	-33	-15	InfTemp-61-33-15
65	-17	-15	InfTemp65-17-15
-22	-26	-16	ParaHipp-22-26-16
25	-26	-14	ParaHipp25-26-14
-02	-36	37	PCC-02-3637
-47	-67	36	LatPar-47-6736
53	-67	36	LatPar53-6736
03	-51	08	RetSplin03-5108

# Activity: Quantifying Network Level rsFC (one way)

□ Anderson (2011):

-04	-52	32	PCC-04-5232
04	-53	35	PCC04-5335
-02	55	-13	vmPFC-0255-13
02	55	-13	vmPFC0255-13
-49	-62	34	TPJ-49-6234
50	-57	36	TPJ50-5736
-43	-38	46	IPS-43-3846
40	-39	51	IPS40-3951
-21	-04	59	EYE-21-0459
27	-06	54	EYE27-0654
-38	14	08	aINS-381408
40	15	08	aINS401508