# SMI 2022 Founder's Talk

# Daniel B. Rowe

## Department of Mathematical and Statistical Sciences Marquette University



May 27, 2022

**Rowe Lab** 



1

# Outline

# Part I. Founding of Section on Statistics in Imaging

- 1. Genesis
- 2. Planning
- 3. Coalescence

# Part II. Foundations of Functional MRI

- 1. Background
- 2. Measured Data
- **3. Opportunities in FMRI**

# Discussion



2

# Outline

Part I. Founding of Section on Statistics in Imaging

- 1. Genesis
- 2. Planning
- 3. Coalescence







## I.1. Genesis

Before there was a section, I used to get the Imaging Statisticians together.

Leading up to each JSM I would email the imaging statisticians I knew. Tom Nichols, Brian Caffo, Martin Lindquist, Hernando Ombao, Hongtu Zhu...

I liked getting together at an Irish Pub so we could have refreshments.

There were many times where it was me and a couple others.







## I.1. Genesis

Before there was a section, I gathered the imaging Statisticians together.

I started the "Society of Imaging Statisticians" AKA SINS.

Everyone emailed the imaging statisticians they knew to email me.

The webpage is still up. http://www.mssc.mu.edu/~daniel/sins.html





## I.1. Genesis

## Before there was a section, I used to get the Imaging Statisticians together.

JSM Imaging Statisticians Get Together - Message (Plain Text) Mon 8/2/2010 10:51 AM Rowe, Daniel JSM Imaging Statisticians Get Together Rowe, Daniel; dbowma3@sph.emory.edu; enbrown1@mit.edu; vera@stat.cmu.edu; bcaffo@jhsph.edu; patrick.carmack@utsouthwestern.edu; jcarew@sph.emory.edu; chung@stat.wisc.edu; dinov@stat.ucla.edu; bill@stat.cmu.edu; yguo2@sph.emory.edu; john.kornak@ucsf.edu; shayasak@wfubmc.edu; hoffmann@mcw.edu; nlazar@stat.uga.edu; То lindstro@biostat.wisc.edu; martin@stat.columbia.edu; blogan@mcw.edu; kary@lanl.gov; rajan@alumni.rice.edu; mp2370@columbia.edu; mumford@ucla.edu; nichols@umich.edu; ombao@stat.brown.edu; schucany@mail.smu.edu; Jeffrey.Spence@utsouthwestern.edu; uci.edu, sternh; jonathan.taylor@stanford.edu; wesleyt+@pitt.edu; () We removed extra line breaks from this message. Hello Brain Imaging Stats People, The last few years (except last year) at the JSM we got together for Dinner and/or Drinks. I think it has been a huge success. I think this is a great opportunity for us to see old friends and meet new ones. I'd like to get together on Wednesday August 4th as it seems to be the date that most can make it. Let's meet in the main lobby at the conference center at say around 5:30 pm. I'll find a good restaurant for dinner and drinks before then. I'll make sure that we can have loud friendly conversation and lots of drinks. I'll find a place not too far from the conference center. We may need a reservation. Everyone that wants to come for dinner email me so we can get a good estimate for the head count. I have tried to make this list as inclusive as possible. I have included all the names from previous years, updated some email addresses, and added a few people. If I missed someone, forward this email to them. If you have any questions just email me. Or you can call my cell. I look forward to a great time. Dan







## I.1. Genesis

## The first I heard about forming a section was an email chain from Henando.

% -----Original Message-----

%From: Hernando Ombao [<u>mailto:ombao@stat.brown.edu</u>] % Sent: Thursday, September 30, 2010 10:31 AM % To: <u>nusser@iastate.edu</u> % Subject:

%

% Dear Sarah -

%

% My name is Hernando Ombao. We have a group of %statisticians who % would like to form a section "Statistics in the Imaging %Sciences" % within the ASA. I believe that Ranjan has already spoken %with you % about this effort.

%

% Is there a document that spells out the policies for %forming a section?

%

% Do you have some time this week or next to talk about %this?

%

% Many thanks for your help!

%

% Hernando

%

#### On Fri, 8 Oct 2010 11:22:16 -0500

"Nusser, Sarah M [STAT]" <<u>nusser@iastate.edu</u>> wrote: % Hi Hernando,

%

% Sorry for the delay in getting back to you. Ranjan did %talk to me about your group.

%

% Rick Peterson is the ASA liaison to the Council of %Sections. He will be the person working with you to %establish your interest group. %

% In the meantime, I've attached a document that %summarizes my understanding at this point. This year the %Council of Sections Governing Board has been trying to %develop a better method of working with Interest Groups.

% We are nearly done with that process, so I don't expect %the information in the document to change much, but it %might. Rick will keep you informed of any meaningful %changes. %

% Sarah





## I.1. Genesis

## The first I heard about forming a section was an email chain from Henando.

-----Original Message-----

From: Hernando Ombao [mailto:ombao@stat.brown.edu] Sent: Friday, October 08, 2010 7:22 PM

To: Bowman, DuBois; Rowe, Daniel; Lindquist, Martin; Zhu, Hongtu; Caffo, Brian; Maitra, Ranjan; Nichols, Thomas; Ombao, Hernando

Subject: SIS Section Formation

Dear All -

I received confirmation from Sarah Nusser and Rick Peterson. Pls read email below. Here's the bottomline:

(1.) It is NOT necessary for SIS to be a special interest group before it becomes a section. We can become a section directly.

(2.) To become a section, here are the requirements:

(a.) Petition with 100 full members.

- To date, we have 45 signatures. Please solicit more signatures.

(b.) List of officers - I guess that is us. What positions would we like to create? Here's a sample from Stat Learning Data Mining: Chair Vice-Chair **Program Chair** Secretary Treasurer **Publications Liaison Officer** 

I suggest that we add the ff: Liaison to the Human Brain Mapping Liaison to the Biomedical Computing

(c.) A proposed Section Charter - It will be good to have 2 people work on this. I can help but I need one more person to work with me. I can get a sample draft from the Section on Stat Learning. Any volunteer?

#### Hernando





## I.2. Planning

## Hernando Ombao obtained a sample charter to work with.

	Sat 10/16/2010 4:27 PM
HO	Hernando Ombao <ombao@stat.brown.edu></ombao@stat.brown.edu>
	Sample Charter
To Bowman	, DuBois; Rowe, Daniel; Lindquist, Martin; Zhu, Hongtu; Caffo, Brian; Maitra, Ranjan; Nichols, Thomas; Ombao, Hernando
Char 16 K	ter_sldm_2008.docx B
Hi All -	
Attached i	s a sample charter.
Brian, Ranj	jan and I volunteered to prepare a draft.
Perhaps - 1 to discuss Thursday r	the three of us could talk even briefly this coming week who does what. Do you have any free time on norning between 9-12 Eastern?
Hernando	





## I.2. Planning

## Brian Caffo took an initial stab at the charter.

	Tue 10/19/2010 9:55 AM
BC	Brian Caffo <bcaffo@gmail.com></bcaffo@gmail.com>
	Re: Section Name
o Thom	nas Nichols
C Ranja	n Maitra; Hernando Ombao; hongtu zhu; Bowman, DuBois; Rowe, Daniel; Lindquist, Martin; Myers,Kary
i This m	essage has extra line breaks.
C 1	harter_imaging_10192010_version_0.docx 8 KB

Here's my first stab at editing the charter and I have since ran out of time. I didn't track the changes as I think we want to change a lot of it. The amendments are all pretty much exactly the same, which need to be discussed.

Also, we have to decide on the name.

(I also deleted a line that said business may be conducted by mail as I'm sure we want to do everything electronically.)

Brian

### Rowe Lab



10

## I.2. Planning

## Of course, coming up with a name is one of the hardest parts.

On Thu, Oct 21, 2010 at 3:47 AM, Ranjan Maitra <maitra@iastate.edu> wrote: Dear friends,

I have spent some time thinking about this over the past couple of days and I have come to the conclusion that Statistics in the Imaging Sciences is probably not the name we want to have. This despite the Just some convoluted rationale for why I am not completely happy with the Statistics in the Imaging Sciences name. Of course, I would happily go with whatever gets ultimately decided.

#### Best wishes,

#### Ranjan



Wed 10/20/2010 3:34 PM hongtu zhu <hzhu@bios.unc.edu> Re:

- Hernando Ombao
- Bowman, DuBois; Rowe, Daniel; Lindquist, Martin; Caffo, Brian; Maitra, Ranjan; Nichols, Thomas; Myers,Kary
- 🕕 We removed extra line breaks from this message.

We are defining image in a more narrow sense.

best

hongtu



Thu 10/21/2010 3:54 AM

**Re: Section name** 

#### Ranjan Maitra То

Cc Hernando Ombao; Bowman, DuBois; Rowe, Daniel; Lindquist, Martin; Zhu, Hongtu; Caffo, Brian; Myers, Kary

I'm happy with either SI (Statistics in Imaging) or Statistics in Imaging Science (SIMS).



Thu 10/21/2010 8:23 AM

Hernando Ombao <ombao@stat.brown.edu> Doodle: Link for poll "Vote on Section Name"

Bowman, DuBois; Rowe, Daniel; Lindquist, Martin; Zhu, Hongtu; Caffo, Brian; Maitra, Ranjan; Nichols, Thomas; Ombao, Hernando; Myers,Kary

(i) We removed extra line breaks from this message.

Thanks Ranjan for clarifying your concerns.

Let's put this to a formal vote via a doodle poll below:

You have initiated a poll "Vote on Section Name" at Doodle. The link to your poll is:

http://doodle.com/participation.html?pollId=vdxmmumzh5fptaqq

### **Rowe Lab**



#### ten.photos@gmail.com on behalf of Thomas Nichols <t.e.nichols@warwick.ac.uk>



## I.2. Planning

## We needed to elect a Founding Section Chair.

On Oct 29, 2010, at 9:56 AM, Thomas Nichols wrote:

Hi all,

To get things rolling, I would like to nominate Martin for Chair.

### -Tom

From: hongtu zhu <<u>hzhu@bios.unc.edu</u>> Date: October 29, 2010 11:26:36 AM EDT To: "Hernando Ombao" <ombao@stat.brown.edu> Subject: Re: SI Moving forward

l would nominate Daniel Rowe for this.

best

hongtu



#### Hi All -

We have some who have graciously volunteered to carry this section to the finish line.

Perhaps others need some time to think this through? Shall we try to complete this part by the weekend?

If you are flexible about serving in any post, please feel free to let me know.

#### Hernando





## I.2. Planning

## We voted and I was elected the Founding Section Chair.



Wed 11/3/2010 10:56 AM

Rowe, Daniel

**RE: Volunteer update** 

- To hongtu zhu; Hernando Ombao
- Cc Bowman, DuBois; Lindquist, Martin; Caffo, Brian; Maitra, Ranjan; Nichols, Thomas; karymyers@gmail.com
- (i) We removed extra line breaks from this message.

ok, I would be willing to serve as first chair (unless there are any objections). I need a week to clear a few things off my desk before getting to it.

Dan





## I.2. Planning

## After Founding Chair, we filled the other founding members.

HO

Wed 11/3/2010 9:08 PM Hernando Ombao <ombao@stat.brown.edu>

Offciers line up for 2010-2012 completed

To Bowman, DuBois; Rowe, Daniel; Lindquist, Martin; Zhu, Hongtu; Caffo, Brian; Maitra, Ranjan; Nichols, Thomas; Ombao, Hernando; karymyers(

Officers-2010-2012.pdf 19 KB

Hi All -

We have finally filled in all the post for the first two years. Many thanks to all who have volunteered. It will be realistic to hold a full election (with the entire section voting) in 2012.

Thanks to Dan who will now carry this application to the finish line!

As Hongtu pointed out, it's not too early to now plan our activities for ENAR 2011, JSM 2011 and beyond.

#### Hernando

Officers 2010-11 Chair Secretary Treasurer Rep to COS Program Chair

2011-12

Chair Secretary Treasurer Rep to COS Program Chair

As you can see, 2010 was already gone. So we pushed all officers back two years.

### **Rowe Lab**



#### Dan Rowe Brian Caffo DuBois Bowman Kary Myers Ranjan Maitra

Hongtu Zhu Brian Caffo DuBois Bowman Kary Myers Martin Lindquist



## I.3. Coalescence

I started working with the ASA to get them the needed documents.

Thu 12/30/2010 1:23 PM

Peterson, Rick <rick@amstat.org>

**RE:** Petition for ASA Section on Imaging

Rowe, Daniel То

#### Hi Rick,

PR

I'm working on gathering all the materials for submission for a new section on Imaging. I have an email that was forwarded to me that includes the text from you "The required petition, proposed charter, and list of Section officers will be submitted to the Council of Sections Governing Board 60 days before either the winter meeting in February or the annual meeting in August."

Do I just send you an email with the petition from over 100 ASA members, our proposed charter, and officers? Do I need to draft a cover letter?

Thanks

Dan







## I.3. Coalescence

## After some modifications, I finally submitted the Section documents.

ASA	Mon 1/3/2011 11:01 A	М				
V CV	Rowe, Daniel					
	RE: Petition for ASA	Section or	n Imaging			
To Peters	son, Rick					^
	narter_SIS.doc I KB	-	PetitionSignatures.docx 25 KB	-	Signatures.docx 325 KB	
er 39	mailaddresses.docx 9 KB	• PDF	Officers-2010-2012.pdf 22 KB	•		
Hi Rick,						<b>^</b>
Attache	d are the documents	for our pr	oposed new section. O	ne questio	n, we determined	
officers	for 2010-2011 and 2	011-2012.	Since if approved, the	section wil	l not be official until J	an
1, 2012.	Do we need to mov	e back dat	es and start officers be	ginning Jar	1, 2012?	
Please for	orward to me any ad	ditional ite	ems that you create for	our propo	sal.	
Thanks f	for your efforts.					
Dan						
Rowe Lal	0					



I made some changes, gathered the signatures and email addresses.



## I.3. Coalescence

## I had to make more changes to the charter.

Tue 2/1/2011 3:12 PM

Peterson, Rick <rick@amstat.org>

**RE: Petition for ASA Section on Imaging** 

To Rowe, Daniel

### Hi Dan,

PR

The chair of the Council of Sections Governing Board is going to contact you regarding the discussion that took place during our meeting on Saturday. Basically the council thought this was worthy to move towards a vote at the Council of Sections Meeting at JSM 2011. The chair is going to recommend some minor changes to the charter. With regard to the officers, if approved, the terms would begin on January 1, 2012 and last to December 31, 2012.

Best, Rick







## I.3. Coalescence

Been waiting through the summer and early fall. We were all getting impatient. Hernando asked for a status update.

## Hernando Ombao

**RE:** Status of the Section

Hi Hernando, There were some additional minor changes needed to the charter and some confusion that they heard that we wanted to change the name to medical imaging. The COS will vote on it on Oct 1. Dan





### 8/25/2011

18

## I.3. Coalescence

Wed 8/31/2011 2:56 PM

Peterson, Rick <rick@amstat.org>

## Still waiting for a vote on the section.

COS Vote to Approve Section on Statistics in Imaging

Wed Pete **COS** To Rowe, Daniel Cc Czajka, John L.

Hi Dan,

I just wanted to keep you in the loop on this process. Today I sent the final version of the charter for the proposed Section on Statistics in Imaging to the Council of Sections and asked that they respond to me with their vote to approve or not approve the formation of this new section. The deadline to vote is September 30. I wanted to give them some time to confer with their section's officers or poll the section members themselves. We'll let you know the results in early October.

If approved by a majority of the Council of Sections, the section will become officially chartered on January 1, 2012.

Please let me know if you have any questions.

Best regards,

Rick

### **Rick Peterson**

Continuing Education & Chapter and Sections Associate









## I.3. Coalescence

## We needed to figure out dues. Not too much and not too little. Just right.

Thu 9/15/2011 3:38 PM	
PR Peterson, Rick <rick@amstat.org></rick@amstat.org>	
RE: COS Vote to Approve Section on Statistics in Imaging	
To Rowe, Daniel	
I You replied to this message on 9/20/2011 4:08 PM.	^
ASA Individual Application.pdf 198 KB	
Hi Dan,	
If the Section on Statistics in Imaging were approved, have you given any thought to what the dues would be? The reason I ask is this time of year we start sending things to the printer to be ready for 2012. One of these items is the ASA membership application. We list the sections of ASA and	
their dues and pass the application out during membership campaigns. If the section is approved at the end of this month, we'd like to include the Section on Statistics in Imaging in the application.	

Best, Rick





## I.3. Coalescence

## We discusses via email.



Thu 9/15/2011 3:56 PM

Rowe, Daniel

#### FW: COS Vote to Approve Section on Statistics in Imaging

To Martin Lindquist; Hernando Ombao; Maitra, Ranjan; Bowman, DuBois; Zhu, Hongtu; Caffo, Brian; Nichols, Thomas



ASA Individual Application.pdf 198 KB

#### Dues?

If they are asking this question then it is s nonnegative sign? I propose \$5 for members and \$2 for students. ASA taxes \$1 on each. Dan

 Zhu, Hongtu
 Imaging
 9/15/2011

 RE: COS Vote to Approve Section on Statistics in Imaging
 9/15/2011

 personally, I have no experience with this.
 I propose \$6 for members and \$1 for students.

 best hongtu

#### Rowe, Daniel

RE: COS Vote to Approve Section on Statistics in Imaging

Then we would get \$5 and \$0. The list of what other sections charge was attached.

9/15/2011

#### **Rowe Lab**



#### Others had opinions too.



## I.3. Coalescence

## We selected \$6 for full members and \$1 for students. ASA taxed each \$1.



Fri 9/16/2011 2:36 PM Rowe, Daniel

**RE: FW: COS Vote to Approve Section on Statistics in Imaging** 

- Thomas Nichols; Martin Lindquist To
- Brian Caffo; Hernando Ombao; Bowman, DuBois; Maitra, Ranjan; Zhu, Hongtu; karymyers Cc

#### Hi All,

#### Let's vote!

- A. \$6,\$2
- B. \$6,\$1
- C. \$5,\$1

I don't think we should go with the \$0 student option because we want students interested in imaging and not just students.

Dan



Tue 9/20/2011 4:06 PM

Rowe, Daniel

**RE: COS Vote to Approve Section on Statistics in Imaging** 

Bowman, F Dubois То

Cc Thomas Nichols; Martin Lindquist; Brian Caffo; Hernando Ombao; Maitra, Ranjan; Zhu, Hongtu; karymyers

#### Hi All,

The vote seems to be for the \$6,\$1 option. I will email that this is what we want.





## I.3. Coalescence

## Finally notified the section was approved!



Thu 10/6/2011 11:25 AM Peterson, Rick <rick@amstat.org>

**Proposed New Section on Statistics in Imaging** 

Rowe, Daniel To

Lepkowski, James M.; King, Eileen C.; Nusser, Sarah M. Cc

#### Dear Dan,

The deadline for the Council of Sections to vote on the proposed new Section on Statistics in Imaging was last Friday, September 29. I am very pleased to report to you that the Council of Sections approved the formation of this section. Congratulations!

The section will be officially chartered beginning January 1, 2012. I have already begun working with other ASA staff so we will be ready to service the new section by that date. This includes listing the section and its officers on the ASA web site and the ability for persons to pay dues to become a member of the section. We discussed the dues rates for the section in an earlier email.

One thing you may consider is creating a web site for the section. When you begin looking into this let me know and we can discuss how ASA can help.

Once again, congratulations. As the ASA sections staff liaison, please do not hesitate if ever there is anything I can do for you and the Section on Statistics in Imaging.

Best regards,

Rick







I.3. Coalescence

First section member. 10-19-2011

By 01-24-12 there were 60 members,

Now 364 members.

**Rowe Lab** 

Search K	esults - American Statistical Association		
AMERICAN STATISTICAL AMERICAN STATISTICAL ASSOCIATION musting the Practice and Profession of	Semantics	CONNECT WITH THE STATISTICAL OMMUNITY	ASA Home   Members Only   Contact   Welcome, Daniel Profile   Communities   Logout Complete your profile
ME MY PROFILE MY P			Search Keyword(s)
My Profile	Soarch Posulte		
Profile			
			Showing 1 to 1 of 1
My Inbox	Switch name to First Last		510Willg 1 to 1 ti 1
My Inbox My Contacts	Switch name to First Last Sort <u>Name Z-A</u>	Sort Company Name A-Z City State Country	Show: 20 per page
My Inbox My Contacts My Community Subscriptions	Switch name to First Last Sort Name Z-A Rowe, Daniel	Sort <u>Company Name A-Z</u> <u>City State Country</u> Marquette University	Show: 20 per page 💌
My Inbox My Contacts My Community Subscriptions My Preferences	Switch name to First Last Sort Name Z-A Rowe, Daniel	Sort <u>Company Name A-Z</u> <u>City State Country</u> Marquette University Associate Professor Milwaukee, WI, United States	Show: 20 per page 💌
My Inbox My Contacts My Community Subscriptions My Preferences My Signature	Switch name to First Last Sort Name Z-A Rowe, Daniel Ro - Ro	Sort <u>Company Name A-Z</u> <u>City State Country</u> <b>Marquette University</b> Associate Professor Milwaukee, WI, United States	Showing Fto For F Show: 20 per page 💌
My Inbox My Contacts My Community Subscriptions My Preferences My Signature My Communities	Switch name to First Last Sort Name Z-A Rowe, Daniel Ro - Ro	Sort <u>Company Name A-Z</u> <u>City State Country</u> Marquette University Associate Professor Milwaukee, WI, United States	Show: 20 per page 💌

Powered by Higher Logic's Connected Community





## I.3. Coalescence

I remember our first officer's meeting at the 2012 JSM in San Diego.

I believe there were only three people and we met at a high table on the patio of a restaurant in San Diego's gas light district.

I think somebody took notes on a napkin.

Now we have a vibrant successful Section on Imaging.





# Outline

# Part II. Foundations of Functional MRI

- 1. Background
- 2. Measured Data
- **3. Opportunities in FMRI**





## II.1. Background

## When I first started reading about FMRI in 1998, I saw pictures of FMRI



#### **Rowe Lab**



Bandettini P.A., Wong E.C., Hinks R.S., Tikofsky R.S, and Hyde J.S. Time course EPI of human brain function during task activation. Magn Reson Med, 25(2):390-397, Submitted February 1992, Published March 1992.



**Rowe Lab** 

## II.1. Background

## When I first started reading about FMRI in 1998, I saw pictures of FMRI



No Exogenous Contrast Agent. Endogenous BOLD Contrast.



Kwong K.K., Belliveau J.W., Chesler D.A., Goldberg I.E., Weissko R.M. Poncelet B.P. Kennedy D.N., Hoppel B.E., Cohen M.S., and Turner R. Oxygenation-sensitive contrast in magnetic resonance image of rodent brain at high magnetic elds. Proc Natl Acad Sci USA, 89(12):5675-5679, March 1992.

## II.1. Background

## When I first started reading about FMRI in 1998, I saw pictures of FMRI



No Exogenous Contrast Agent. Endogenous BOLD Contrast.

### **Rowe Lab**



Ogawa S., Tank D.W., Menon R.S., Ellermann J.M. ad Kim S.G., Merkle H., and Ugurbil K. Intrinsic signal changes accompanying sensory stimulation: Functional brain mapping with magnetic resonance imaging. Proc Natl Acad Sci USA, 89(13):5951-5955, March 1992.



## II.1. Background

## I joined a research group at Caltech in 1999 and published in 2001.







### Magnitude-Only Time Series



Rowe DB. Bayesian source separation for reference function determination in fMRI. Magn. Reson. Med. 46(2):374-378 (2001).





At MCW in 2001 I learned time series not just *k*-space are complex-valued.

from Proc. 5<sup>th</sup> Mtg. ISMRM, Vancouver, Canada, p. 1671, 1997.

## **Detection of BOLD fMRI Signals Using Complex Data**

SONG LAI, G.H. GLOVER Lucas MR Center, Department of Radiology Stanford University, Stanford, CA 94305-5488

$$cc = \frac{\left\{ \left[ \Sigma(x - \bar{x}) (r - \bar{r}) \right]^2 + \left[ \Sigma(y - \bar{y}) (r - \bar{r}) \right]^2 \right\}^{1/2}}{(N-1) \sigma_r \sqrt{\sigma_x^2 + \sigma_y^2}}$$

x = Re(I) and y = Im(I)

r is time-dependent periodic reference signal

## Very simple model.



Figure 1. Right hand finger tapping activation maps from complex data (a), magnitude detection (b), and NMR phase detection (c), respectively. The bright pixels in Fig. d are seen in both the magnitude detection (b) and the phase detection (c), most likely delineating large veins [2].



## At MCW in 2001 I learned time series not just k-space are complex-valued.

IEEE TRANSACTIONS ON MEDICAL IMAGING, VOL. 18, NO. 4, APRIL 1999

## Generalized Likelihood Ratio Detection for fMRI Using Complex Data Fangyuan Y. Nan and Robert D. Nowak

$$\mathbf{x} = (a\mathbf{1} + b\mathbf{r})(\cos\vartheta + i\sin\vartheta) + \sigma \mathbf{n}_c.$$

$$\mathbf{y} = \mathbf{S} \boldsymbol{\phi} + \boldsymbol{\mu} \mathbf{H} \boldsymbol{\phi} + \boldsymbol{\sigma} \mathbf{n}$$

$$\mu = b/a \text{ and } \qquad \begin{aligned} \mathbf{y} &= \begin{bmatrix} \mathbf{x}_R \\ \mathbf{x}_I \end{bmatrix}, \quad \mathbf{S} &= \begin{bmatrix} \mathbf{1} & \mathbf{0} \\ \mathbf{0} & \mathbf{1} \end{bmatrix}, \quad \mathbf{H} &= \begin{bmatrix} \mathbf{r} & \mathbf{0} \\ \mathbf{0} & \mathbf{r} \end{bmatrix} \\ \phi &= \begin{bmatrix} a\cos\vartheta \\ a\sin\vartheta \end{bmatrix}, \quad \mathbf{n} &= \begin{bmatrix} \mathbf{n}_{cR} \\ \mathbf{n}_{cI} \end{bmatrix}. \end{aligned}$$

Simple model and only simulated data.



Fig. 3. Simulated fMRI experiment. (a) Brain image with simulated activation region highlighted. The MC test, CC test, and GLRT test are compared in (b)-(d). A threshold was selected for each test to produce a  $P_f = 0.01$ . (b) MC test results. Detection rate  $P_d = 0.77$ . (c) CC test results.  $P_d = 0.70$ . (d) GLRT results.  $P_d = 0.79$ .





## In 2004 published paper on a more general model to experimental data.

D.B. Rowe, B.R. Logan / NeuroImage 23 (2004) 1078–1092

## A complex way to compute fMRI activation<sup>\*\*</sup>

Daniel B. Rowe<sup>a,\*</sup> and Brent R. Logan<sup>b</sup>

<sup>a</sup>Department of Biophysics, Medical College of Wisconsin, Milwaukee, WI 53226, USA <sup>b</sup>Division of Biostatistics, Medical College of Wisconsin, Milwaukee, WI, USA

$$\begin{pmatrix} y_{Rt} \\ y_{It} \end{pmatrix} = \begin{pmatrix} \rho_t \cos \theta \\ \rho_t \sin \theta \end{pmatrix} + \begin{pmatrix} \eta_{Rt} \\ \eta_{It} \end{pmatrix}$$

**Bivariate Observations** 

 $y_{Rt} = \rho_t \cos \theta + \eta_{Rt}$  $y_{It} = \rho_t \sin \theta + \eta_{It}$ 

 $\rho_t = \beta_0 + \beta_1 x_{1t} + \dots + \beta_{q_1} x_{q_1t}$ 

**Rowe Lab** 

**Real and Imaginary** 

More advanced model applied to experimental data.







b) Complex Model

Threshold

33

## **II.2. Measured Data**

In each voxel at time *t*:

$$\begin{pmatrix} y_{Rt} \\ y_{It} \end{pmatrix} = \begin{pmatrix} \rho_t \cos \theta_t \\ \rho_t \sin \theta_t \end{pmatrix} + \begin{pmatrix} \eta_{Rt} \\ \eta_{It} \end{pmatrix} + \begin{pmatrix} \eta_{Rt} \\ \eta_{It} \end{pmatrix} + \begin{pmatrix} \eta_{Rt} \\ \eta_{It} \end{pmatrix} + \begin{pmatrix} \eta_{Rt} \\ \eta_{Rt} \end{pmatrix} + \begin{pmatrix} \eta_{Rt} \\ \eta_{$$

$$\rho_t = \beta_0 + \beta_1 x_{1t} + \dots + \beta_{q_1} x_{q_1t}$$
  
$$\theta_t = \theta$$

 $\rho_t = \beta_0 + \beta_1 x_{1t} + \dots + \beta_{q_1} x_{q_1t}$  $\theta_t \neq \theta_{t'}$ 

$$\rho_t = \beta_0 + \beta_1 x_{1t} + \dots + \beta_{q_1} x_{q_1t}$$
  
$$\theta_t = \gamma_0 + \gamma_1 u_{1t} + \dots + \gamma_{q_2} u_{q_2t}$$

$$\begin{aligned} \beta_t &\neq \beta_{t'} \\ \theta_t &= \gamma_0 + \gamma_1 u_{1t} + \dots + \gamma_{q_2} u_{q_2 t} \end{aligned}$$

Three possible changes.

<sup>1</sup>Rowe and Logan: NIMG, 23:1078-1092, 2004. <sup>2</sup>Rowe: NIMG 25:1124-1132, 2005a. <sup>3</sup>Rowe: NIMG, 25:1310-1324, 2005b. <sup>4</sup>Bandettini et al.: MRM, 30:161-173, 1993. <sup>5</sup>Rowe and Logan: NIMG 24:603-606, 2005. <sup>6</sup>Rowe, et al.: JNSM, 161:331-341, 2007. <sup>7</sup>Rowe: MRM, 62:1356-1357, 2009.

- Magnitude w/ Constant Phase (CP) Activation<sup>1,2</sup>
- Magnitude and/or Phase (MP) Activation<sup>3,7</sup>
- Magnitude-Only (MO) Activation (Discard Phase)<sup>4,5</sup>
- Phase-Only (PO) Activation (Discard Magnitude)<sup>6</sup>



#### **Rowe Lab**



34

## **II.2. Measured Data**

## Results from various activation models.

 $\begin{pmatrix} y_{Rt} \\ y_{It} \end{pmatrix} = \begin{pmatrix} \rho_t \cos \theta_t \\ \rho_t \sin \theta_t \end{pmatrix} + \begin{pmatrix} \eta_{Rt} \\ \eta_{It} \end{pmatrix}$  $y_I$ 1.2 -MÔ/UP<sup>64</sup> Č₽ 0.8 maginary 0.4 m0.2 0~ 256 224 192 160 128 1.2  $y_R$ 0.8 96 0.6 0.4 64 40 0.2 time UP/MO & CP UP/MO & PO rea

Rowe and Logan: NIMG, 23:1078-1092, 2004.

Presented at 2005 JSM

#### **Rowe Lab**



35

## 1.5T GE Signa





#### Rowe: NIMG, 25:1310-1324, 2005b.

Rowe: NIMG, 25:1310-1324, 2005b. Rowe, et al.: JNSM, 161:331-341, 2007.

As it turns out, there is biological info in the phase trough space.



Signal Eqn.

# EPI Image GRE T2\*

**Rowe Lab** 



#### Biological structure through space

#### $\Delta B(x, y)$



As it turns out, there is biological info in the phase through









## **II.2. Measured Data**

## As it turns out, there is biological info in the phase trough time.





1. pial artery 2. long cortical artery 3. middle cortical artery 4. short cortical artery 5. cortical vein

**Rowe Lab** 

6. subpial zone 7. precapillary vessels 8. superficial capillary zone 9. middle capillary zone 10. deep capillary zone

Figure (left,center) Reina-de la Torre et al.: The Anatomical Record, 1998.

Figure (right) Duvernoy et al. Brain Res Bull 7:519-579, 1981. Data (right) Yamaguchi et al. Int J Microcirc Clin Exp 1992.



<sup>1</sup>Menon: MRM, 47:1-9, 2002., <sup>2</sup>Nencka, Rowe: NIMG, 177-88, 2007.



## As it turns out, there is biological info in the phase through time.



#### **Rowe Lab**





#### Chow et al.: NIMG, 2006.









An illustrative example of the DFT as a linear process.



**Rowe Lab** 



#### \*Similar presented at 2006 JSM







We can write the 2D DFT as a matrix multiplication & include other processes.









Rowe DB: Image Reconstruction in Functional MRI. (205-232) In Handbook of Statistical Methods for Brain Signals and Images, Chapman & Hall/CRC Press.

Examples of matrix pre-multiplication reconstruction/processing operators.



**Rowe Lab** 



18482 rows for 96 × 96 image



Rowe DB: Image Reconstruction in Functional MRI. (205-232) In Handbook of Statistical Methods for Brain Signals and Images, Chapman & Hall/CRC Press.

Effects of image operations on image mean.





## **II.2. Measured Data**

Rowe DB: Image Reconstruction in Functional MRI. (205-232) In Handbook of Statistical Methods for Brain Signals and Images, Chapman & Hall/CRC Press.

## Effects of image operations on image correlation.

25×25 correlation matrix



1 2 3 4 5 6 7 8 9 10111213141516171819202122232425





a) O=Ω

b)  $O=\Omega Z$ 

c)  $O=\Omega A$ 

g)  $O = S\Omega Z$ 



e)  $O=\Omega AZ$ 

f)  $O = S\Omega A$ 

### **Rowe Lab**



## d) $O=S\Omega$

### h) $O=S\Omega AZ$





#### Can look at induced time series correlation.

## We can generalize this to *n k*-space arrays/images.



This allows us to directly link the measured k-space data to images.

#### **Rowe Lab**



k-space



**46** 

## **II.2. Measured Data**

## Can look at the effects of multicoil imaging





#### **Rowe Lab**



#### combined image



#### Bruce et al, MRI 2011.



Can set up usual SENSE reconstruction as a matrix oeration.







Usual SENSE reconstruction induces long range correlations.

y = Of  $E(f) = \delta$   $cov(f) = \Gamma$   $E(y) = O\delta$  $cov(f) = O\Gamma O^{T}$ 





#### **Rowe Lab**



#### Bruce et al, MRI 2011.



## **II.3. Opportunities in FMRI**

## Opportunities in Bayesian image reconstruction.



**Posterior PDF**  $p(S, v, \sigma^2 \mid a)$ 



Figure 4: True non-task unaliased image (top left), BSENSE MAP unaliased non-task magnitude image (top right) using ICM, Mean BSENSE unaliased non-task magnitude image (bottom left) using Gibbs sampling, and SENSE non-task magnitude image (bottom right).

#### **Rowe Lab**



#### Sakitis et al. SMI 2022.



## **II.3. Opportunities in FMRI**

Opportunities still exist.

Digging deeper to properly model measured data.

Potential for increased biological knowledge.

Think about the biology and not fitting a model to data.





51

## Part I. Founding of Section on Statistics in Imaging

Dear Dan,

The deadline for the Council of Sections to vote on the proposed new Section on Statistics in Imaging was last Friday, September 29. I am very pleased to report to you that the Council of Sections approved the formation of this section. Congratulations!

Once again, congratulations. As the ASA sections staff liaison, please do not hesitate if ever there is anything I can do for you and the Section on Statistics in Imaging.

Best regards,

Rick

## Part II. Foundations of Functional MRI







# **Thank You**

# **Questions?**



