

# FMRI Analysis

*Experiment Design*

Scanning

Pre-Processing

Individual Subject Analysis

Group Analysis

Post-Processing

## Scheme of the Talk

- **Players in Experiment Design**
- **Intuitive Thinking**
  - Useful bandwidth for fMRI data
- **Statistical Theory**
  - Efficiency
- **Experiment Design in AFNI**
  - AlphaSim and 3dDeconvolve
- **Miscellaneous**

## Players in Experiment Design

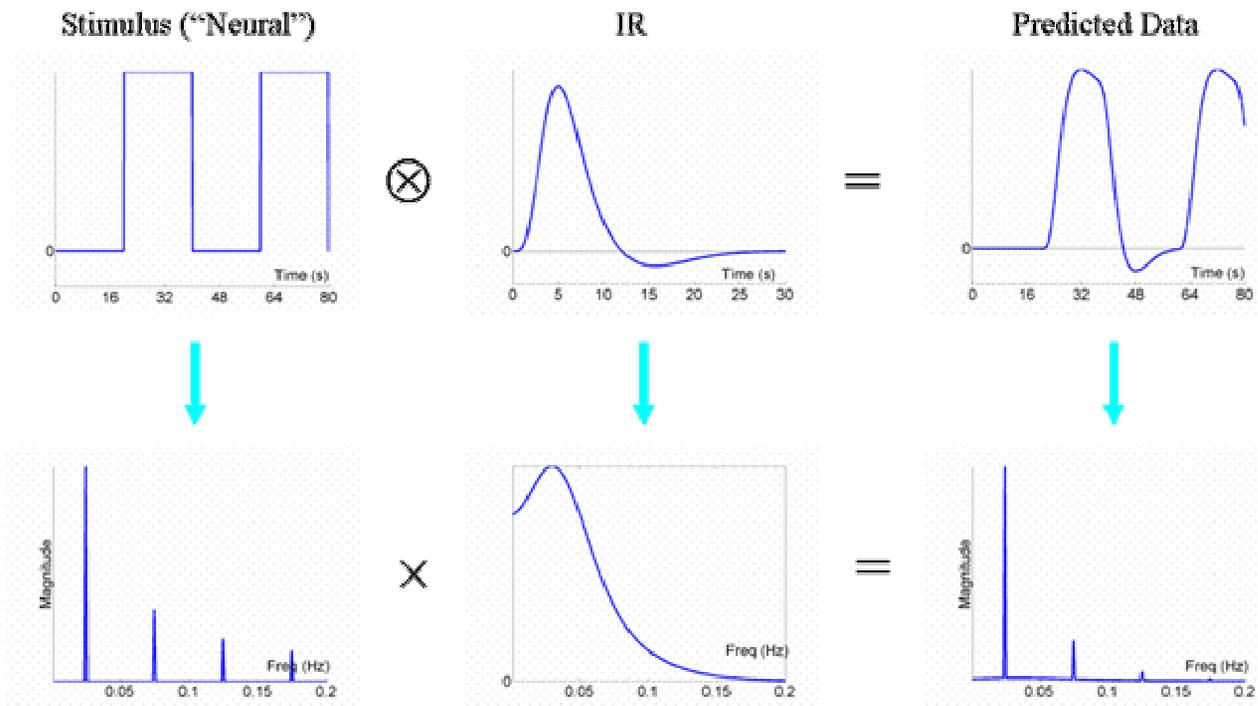
- **Number of subjects ( $n$ )**
  - Important for group analysis: inter-subject vs. intra-subject variation
  - Power roughly proportional to  $\sqrt{n}$
  - Recommended: 20+; Current practice: 12 – 20
- **Number of time points**
  - Important for individual subject analysis
  - Power proportional to  $\sqrt{DF}$
  - $N$  limited by subject's tolerance in scanner: 30-90 min per session
- **TR length**
  - Shorter TR yields more time points (and potentially more power)
  - Power improvement limited by stronger temporal correlation and weaker MR signal
  - Usually limited by hardware considerations

## Players in Experiment Design

- **Study design**
  - Complexity: factors, levels, contrasts of interest, balance of events/levels/subjects...
  - Design choices may limit statistical analysis options
- **Number of events per class**
  - The more the better (20+), but no magic number
- **HRF modeling**
  - Different regions may have different response curves
- **Event arrangement** (☀focus of this talk)
  - How to design? How to define 'best'?
  - Efficiency: achieve highest power within fixed scanning time

# Intuitive Thinking

- Classical IRF



## Intuitive Thinking

- Event frequency
  - Optimal freq: 0.03 Hz (period 30 s)
    - Implication for block designs: optimal duration – about 15s
  - Upper bound: 0.15 Hz (6.7 s)
    - Submerged in the sea of white noise
    - Implication for event-related designs: average ISI > 3 ~ 4 s
  - Lower bound? 0.01 Hz (100 s)
    - Confounded with trend or removed by high-pass filtering
    - Implication for block designs: maximum duration about 50s\*
      - \*Longer blocks could still be analyzed (see last slide)
  - Bandwidth: 0.15 – 0.01 Hz
    - Spread events within the frequency window

## Statistical Theory

- Regression Model (GLS)
  - $Y$  (one column of data @ each voxel) =  $X\beta + \varepsilon$
  - $X$ : design matrix with columns of regressors
- General Linear testing
  - $H_0: c'\beta = 0$  with  $c = (c_0, c_1, \dots, c_p)$ 
    - $t = c'\beta / \text{sqrt}(c'(X'X)^{-1}c \text{MSE})$  (MSE: unknown but same across tests)
    - $\text{sqrt}(c'(X'X)^{-1}c)$ : normalized standard deviation of  $c'\beta$ 
      - Efficiency =  $1/\text{sqrt}(c'(X'X)^{-1}c)$ : Smaller → more powerful (and more efficient)
      - $X'X$  measures the co-variation among the regressors
      - Less correlated regressors are more efficient and easier to tease apart
      - Goal: find  $X$  that would give lowest  $\text{sqrt}(c'(X'X)^{-1}c)$
  - Multiple tests: Efficiency in AFNI = sum of individual test efficiencies
    - A relative value

## Experiment Design in AFNI

- AFNI programs for experiment design
  - **RSFgen**: Design X by generating randomized events

```
RSFgen -nt 300 -num_stimts 3 \
      -nreps 1 50 -nreps 2 50 -nreps 3 50 \
      -seed 103859 -prefix RSF.stim.001.
```
  - **3dDeconvolve -nodata**: calculate efficiency
    - May have a more user-friendly Python script in the future
- Detailed scripts and help
  - **HowTo#3**: [http://afni.nimh.nih.gov/pub/dist/HOWTO//howto/ht03\\_stim/html/AFNI\\_howto.shtml](http://afni.nimh.nih.gov/pub/dist/HOWTO//howto/ht03_stim/html/AFNI_howto.shtml)

## Miscellaneous

- Nothing is best in absolute sense
  - Modeling approach
    - Pre-fixed HRF or basis function modeling?
  - Specific statistical test
    - Good design for one test is not necessary ideal for another
- Sequence randomization always good?
  - Experiment constraint
  - May not change efficiency much
  - Good from other perspectives: Efficiency is not everything!
    - Neurological consideration: saturation, habituation, expectation/predictability

## Miscellaneous

- Dealing with low frequencies
  - Modeling drifting with polynomials (additive effect)
  - High-pass filtering (additive effect): 3dFourier –highpass
  - Global mean scaling (multiplicative or amplifying effect)
- Control condition
  - Baseline rarely meaningful especially for higher cognitive regions?
  - If interest is on contrasts, null events are not absolutely necessary
  - High-pass filtering (additive effect)
  - Scaling by and regressing out ventricular signal