STUDY ICA component clustering

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#### **Precompute data measures**

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	Status	s		R	eady to pr	ecluster				
	Total	size (M	b)	31	0.4					

#### **Precompute data measures**

#### TIP: Compute all measures so you can

#### test different combinations for clustering

	👃 Sele						
	Pre-						
Compute ERP/spectrum/ERSP only for components selected by RV (set) or for all components (unset)							
	List	of measures to prece	ompute				
L	<b>V</b>	ERPs	Baseline ([min max] in m	is)	[-200 0]		
L	<b>V</b>	Power spectrum	Spectopo parameters			Test	
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### **Cluster components**

-	EE	GLAB v6.0b								
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	Nb of sessions	Cluster components								
	Nb of groups	Edit/plot clusters	Select ar	nd compute com	ponent mea	asures for later clusteri	ng pop_p	reclust()		
	Epoch consistency Channels per fram	/ yes								
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			ITCs	10	1	Time range [ms]	0 600	Freq. range [Hz]	2 30	
			Final dimensions	10	Help					
			Save STUDY to file	/	home/juli	ie/WorkshopSD2007/	STUDY/ati	tention.study		
			Cancel			Help		Ok		

#### **Precluster schematic**





## **Classical KMean**



#### **Cluster components**





#### Choosing data measures

What measure(s) should you use?

It depends on your final cluster criteria...

- If for example, your priority is dipole location, then cluster only based on dipole location...

But consider:

- What is the difference between these two components?



#### **Choosing data measures**



#### **Plot/edit clusters**



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#### **Plot cluster data**



#### **Plot cluster data**



#### **Plot cluster data**



#### Issue with standard clustering

Large parameter space problem: many different clustering solutions can be produced by changing parameters and measure subsets. Which one should we choose?

Select and compute component measures for later clustering -- pop_preclust()  $-\Box \times$ Pre-compute measures on which to cluster components from study 'N400STUDY' **EEGLAB** clustering Select the cluster to refine during sub-clustering (any existing sub-hierarchy will be overwritten) has ~12 parameters ParentCluster 1 (151 ICs) Pre-compute or Load Norm. Rel. Wt. Dims. Frequency range [Hz] 3 25 ×. spectra 10 1 ERPs × Latency range in ms [lo hi] × 10 -2100 1995 1 dipoles × 10 × scalp maps × 10 1 Use channel values Absolute values ×. ERSPs Time/freq. parameters e', [3 25], 'cycles', [3 0.5], 'pa ×. 10 1 × ITCs. 10 1 Time/lied_baraineters t, [3-25]. toyolest, [3-0-5], ipa Final dimensions ×. 10 Help Save STUDY to file /data/common4/amo/Ssubjects/N400preclust.study Cancel Help Ok

#### **Measure projection**

# (EEGLAB plug-in by Nima Bigdely Shamlo) only has one pre-clustering parameter.

Measure Product clusteri Number of clusters to compute Relative dipole weight (between Select measuretures to be used	ng pop_mpcluster() _
<ul> <li>✓ Dipo</li> <li>✓ ERP</li> <li>□ ERSP</li> <li>□ ITC</li> <li>✓ Spect</li> <li>□ Scalp</li> </ul>	e ira map
Separate outliers (enter std.)	3
Help	<u>Cancel</u> Ok



#### **Measure projection**

- Instead, we can directly work on pair-wise similarity matrices and prevent ICs with similarities less than certain threshold (e.g., ERSP corr. < 0.5) to be clustered together.
- The most important measure is equivalent dipole
   location

#### **Measure Projection Toolbox**









## Exercise

- Load the Stern STUDY (STUDY folder)
- Precluster (pre-computation already done) and cluster components using measures of your choice. Experiment with different measures.

