



Università degli Studi di Milano Bicocca

Scuola di Scienze

Dipartimento di Informatica, Sistemistica e Comunicazione

Corso di laurea in Informatica

ANALISI DI SEGNALI EEG TRAMITE CONVOLUZIONE WAVELET

Relatore: Prof. Francesca Gasparini

Co-relatore: Dott.ssa Silvia Elena Corchs

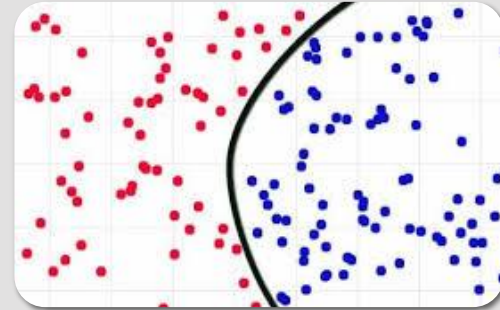
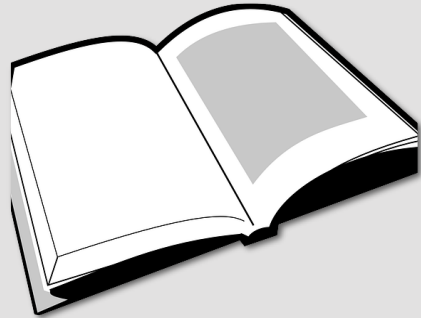
Relazione della prova finale di:

Lorenzo Sasso

Matricola 809055

Anno Accademico 2017-2018

GLI OBIETTIVI DEL PROGETTO



Analisi dello stato
dell'arte sullo
studio dei segnali
EEG

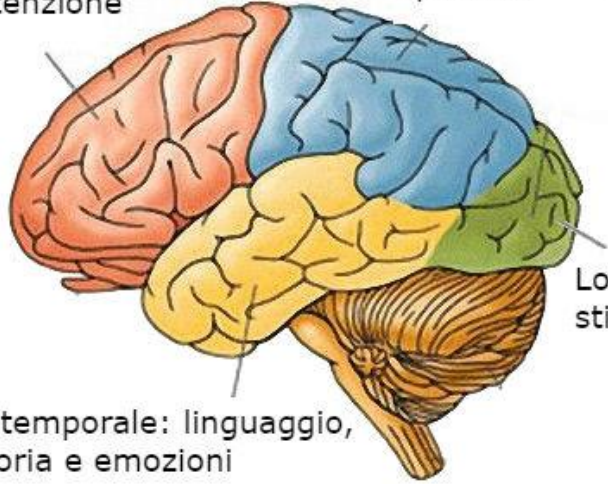
Effettuare
un'analisi
tempo–frequenza
di un segnale EEG

Utilizzare tecniche
di analisi dei dati
per confrontare il
movimento reale
da uno
immaginato

Anatomia del cervello e i ritmi EEG

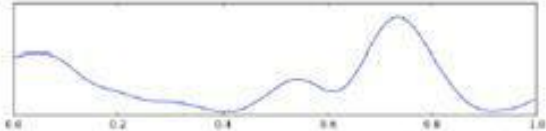
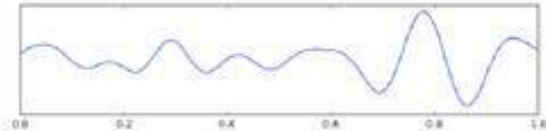
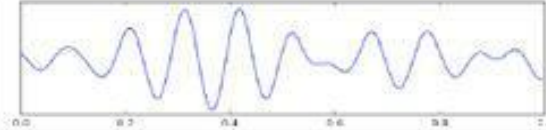
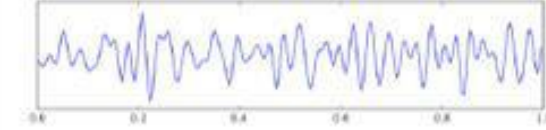
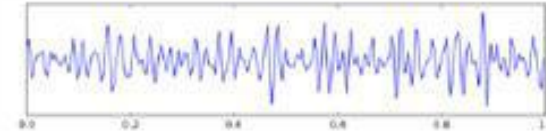
Lobo frontale: responsabile della pianificazione e attenzione

Lobo parietale: riconoscimento spaziale



Lobo occipitale: interpreta stimoli visivi

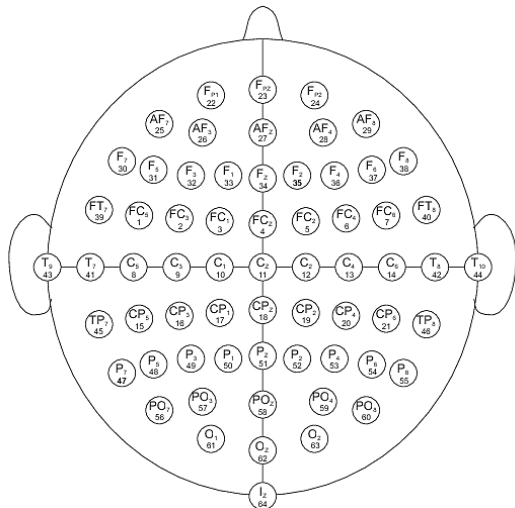
Lobo temporale: linguaggio, memoria e emozioni

Type	Frequency range (Hz)	Signal Shape
Delta (Δ)	1-3	
Theta (Θ)	4 - 7	
Alpha (α)	8 - 15	
Beta (β)	12 - 30	
Gamma (γ)	> 30	

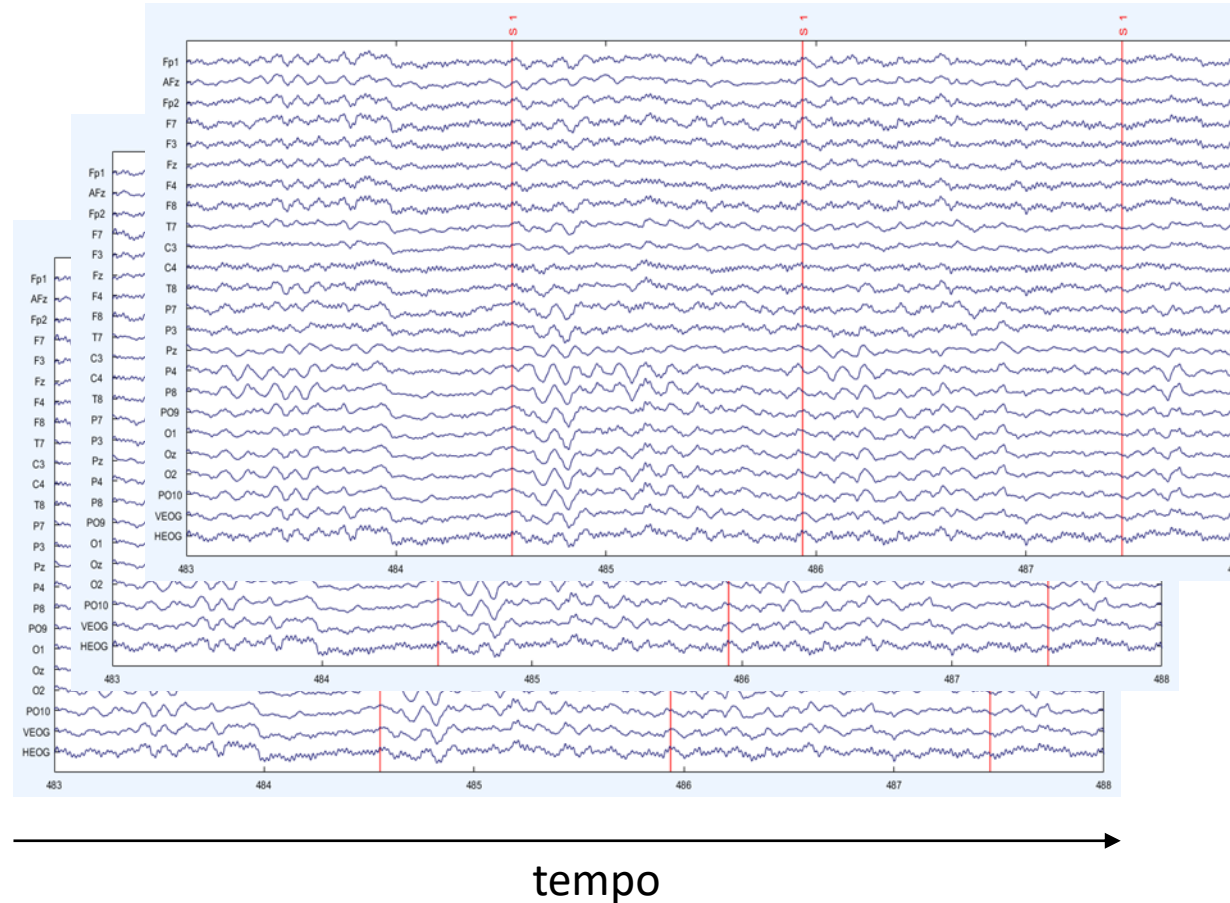
Analisi di segnali EEG

I dati EEG sono:

- Tempo – varianti
- Segnali multidimensionali
 - ✓ N elettrodi
 - ✓ M soggetti



N elettrodi



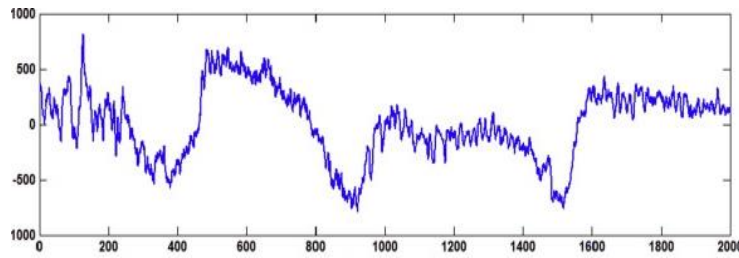
Mogetti



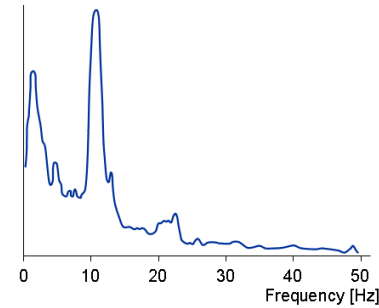
Analisi di segnali EEG

In base alla dimensione, al dominio e ai metodi utilizzati possono essere effettuate diverse tipi di analisi :

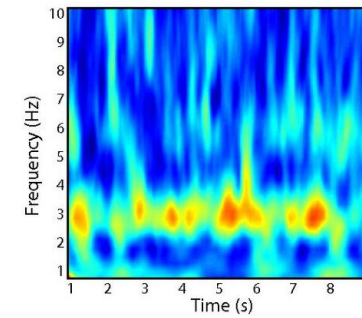
Tempo



Frequenza

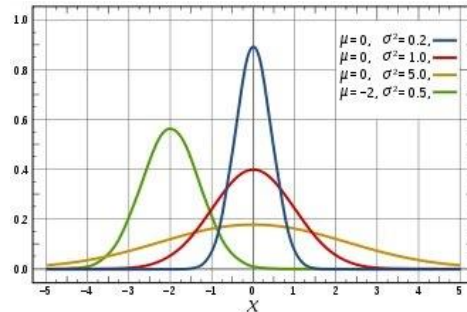


Tempo - frequenza

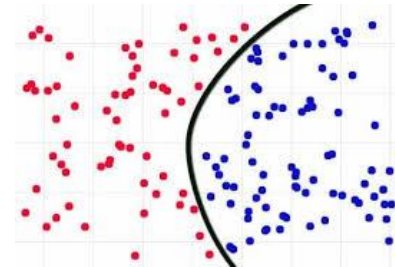


DOMINIO

Statistica inferenziale



Machine learning (classificatori)

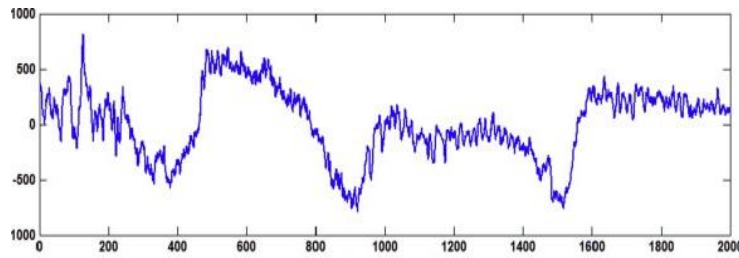


METODI

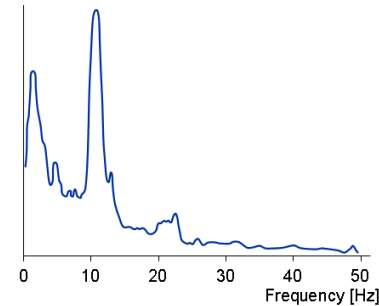
Analisi di segnali EEG

In base alla dimensione, al dominio e ai metodi utilizzati possono essere effettuate diverse tipi di analisi :

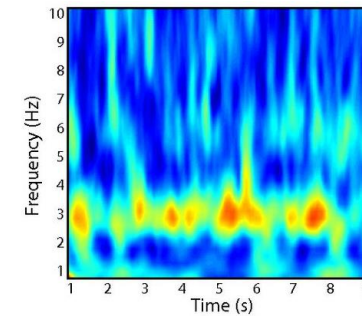
Tempo



Frequenza

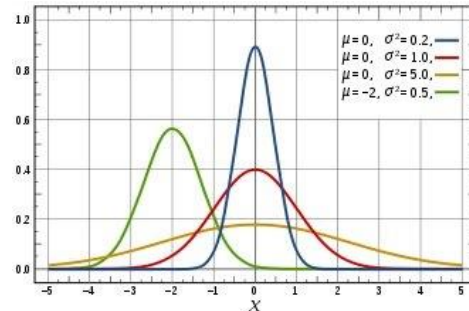


Tempo - frequenza



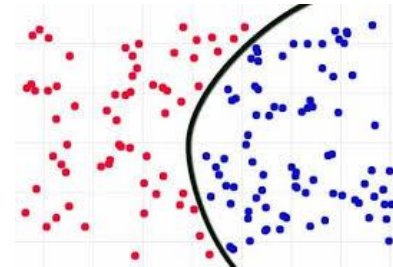
DOMINIO

Statistica inferenziale



ANOVA

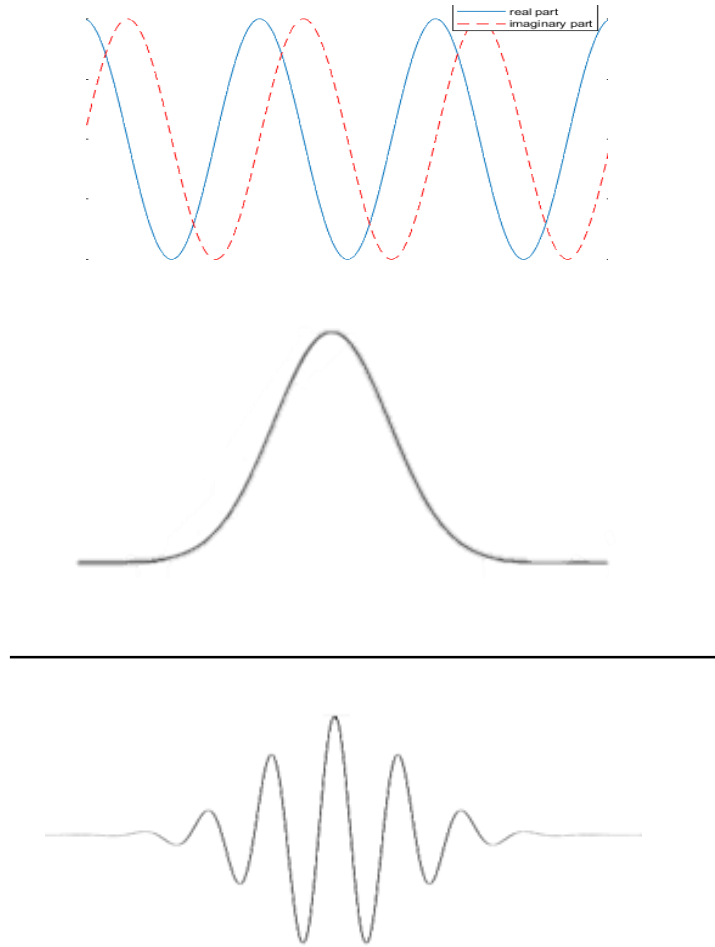
Machine learning (classificatori)



**«CLASSIFICATION
LEARNER»**

METODI

Morlet wavelet



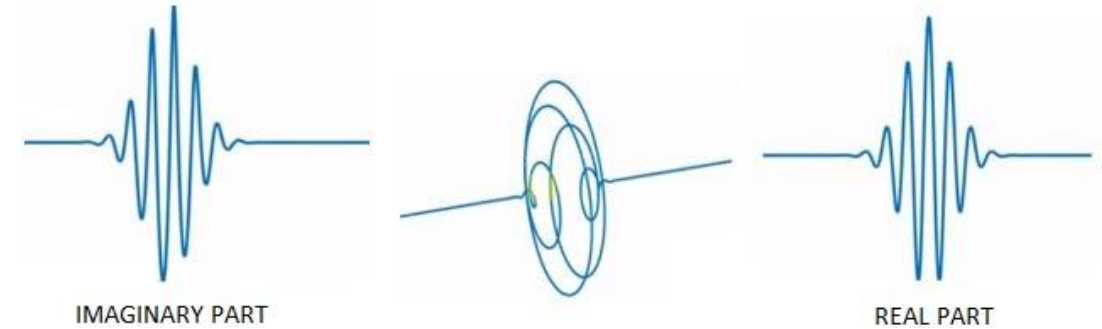
Onda seno
complessa

*

Gaussiana

Morlet wavelet

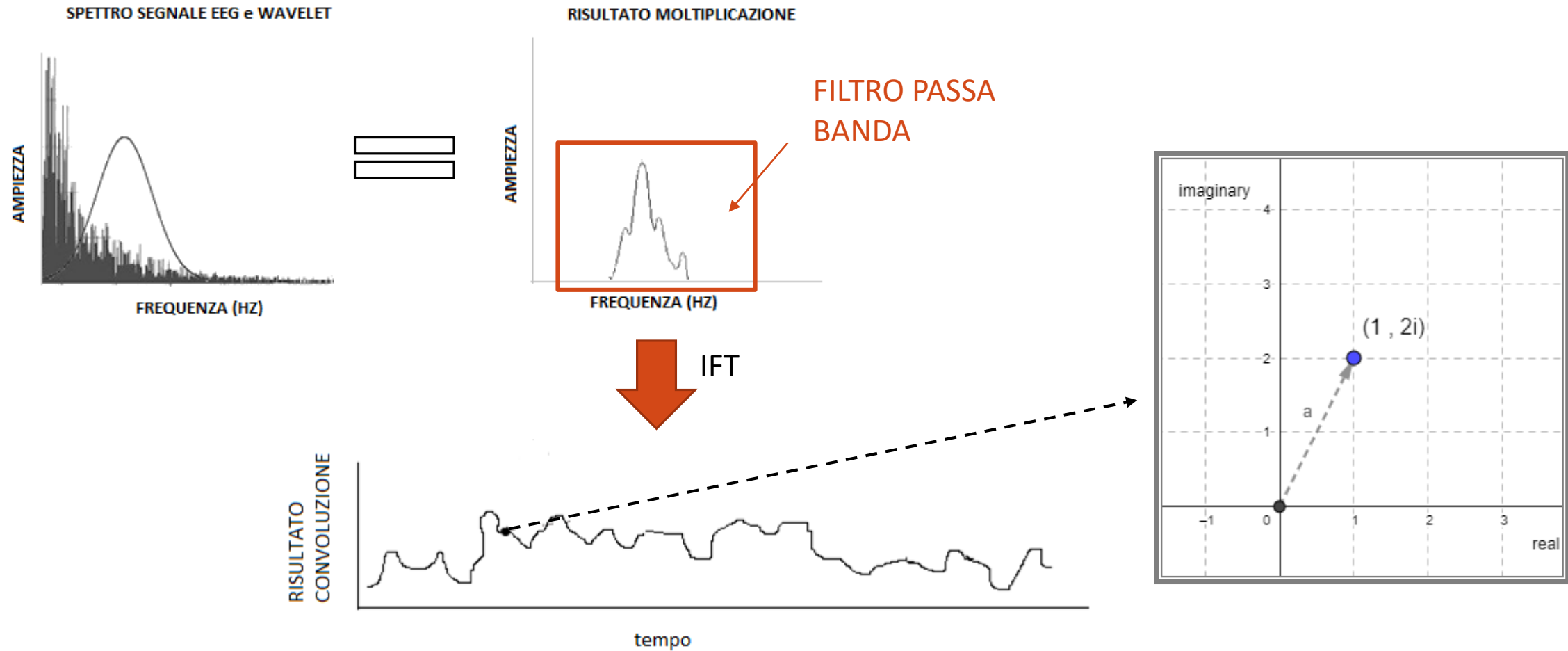
Dominio temporale



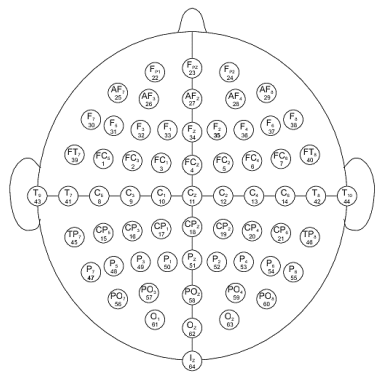
Dominio frequenziale



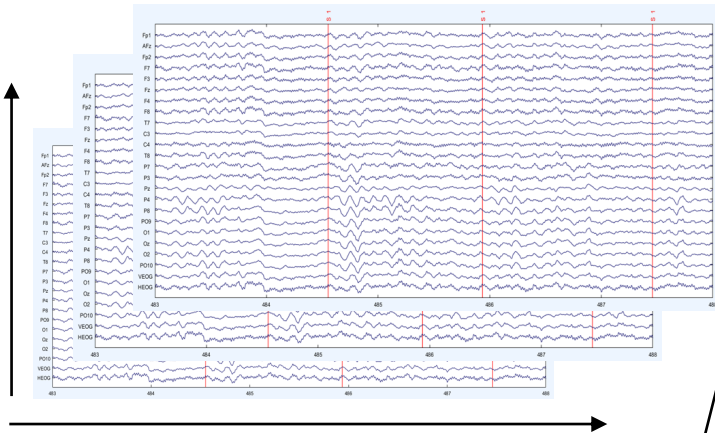
Convoluzione: significato e informazioni estraibili dal risultato



Esperimenti: il dataset www.physionet.org/pn4/eegmmidb



64 elettrodi



tempo (60'' /120'')

109 soggetti



Registrazioni per soggetto

• x1



x1



BASLINE

• x3



x3

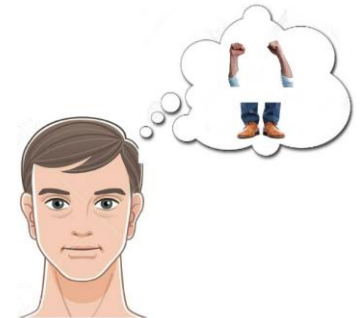


TASK

• x3



x3



BASLINE



60 s

TASK



4.2s 4.1s 4.2s 4.1s



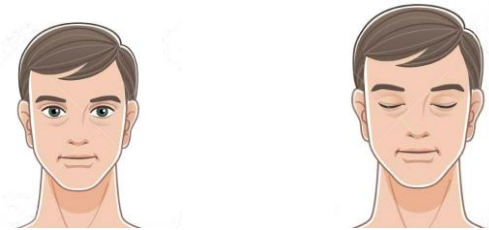
4.2s 4.1s

120 s

Esperimenti: le prove

Population-based

- Esperimento 1



x 109 vs x 109

Population-based

- Esperimento 2



x 103 vs x 103

Subject-based

- Esperimento 3



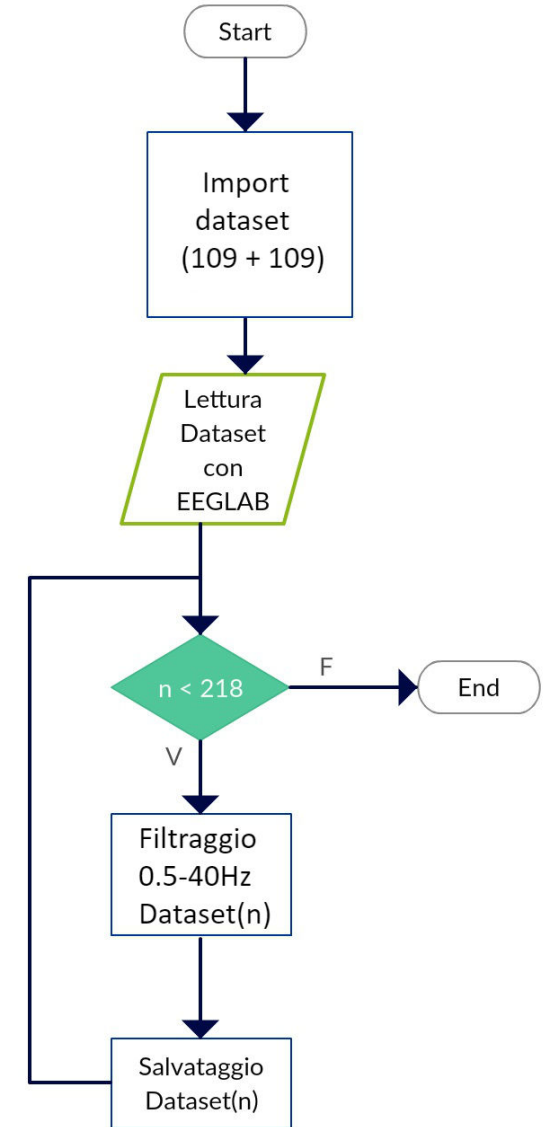
x 1 vs x 1

Population-based

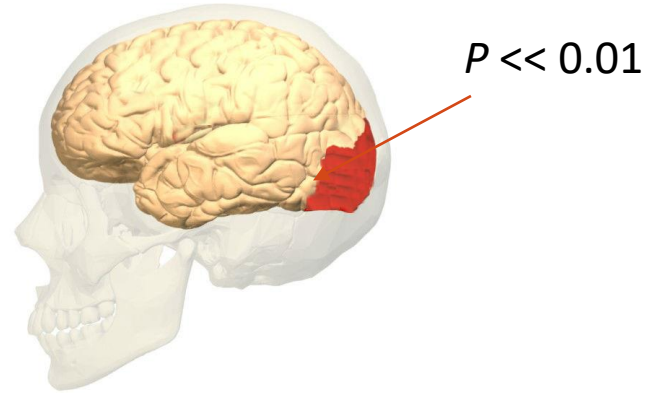
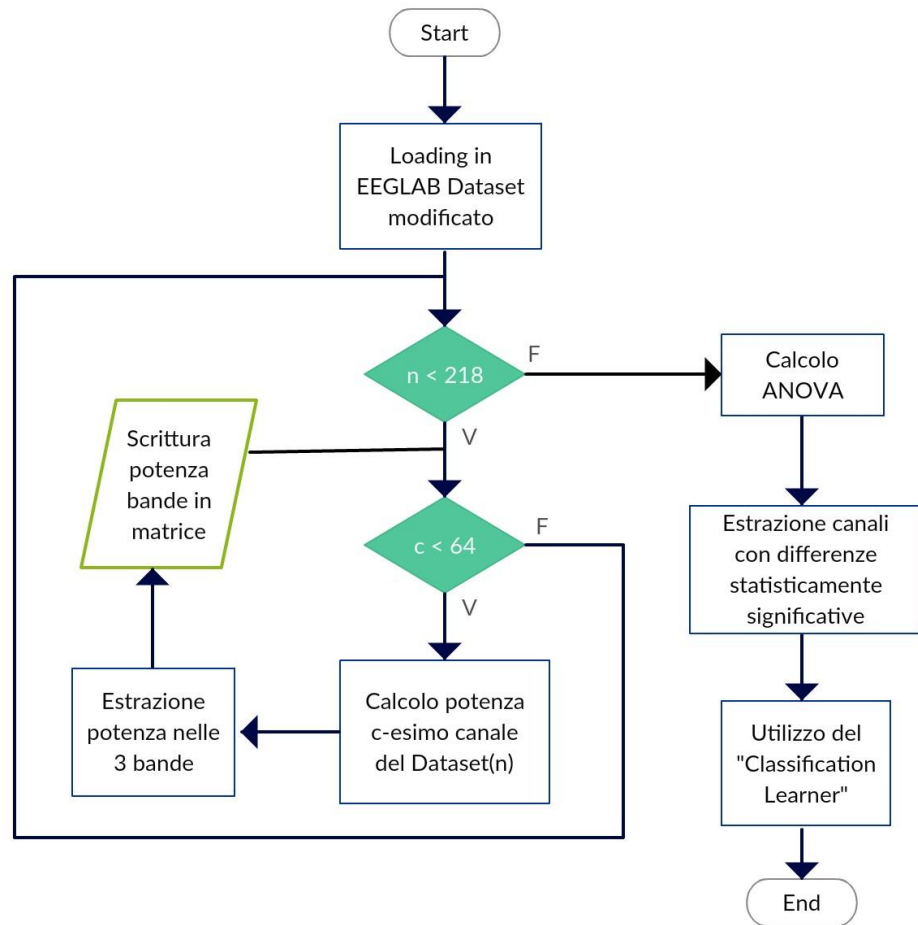
- Esperimento 4



x 309 vs x 309

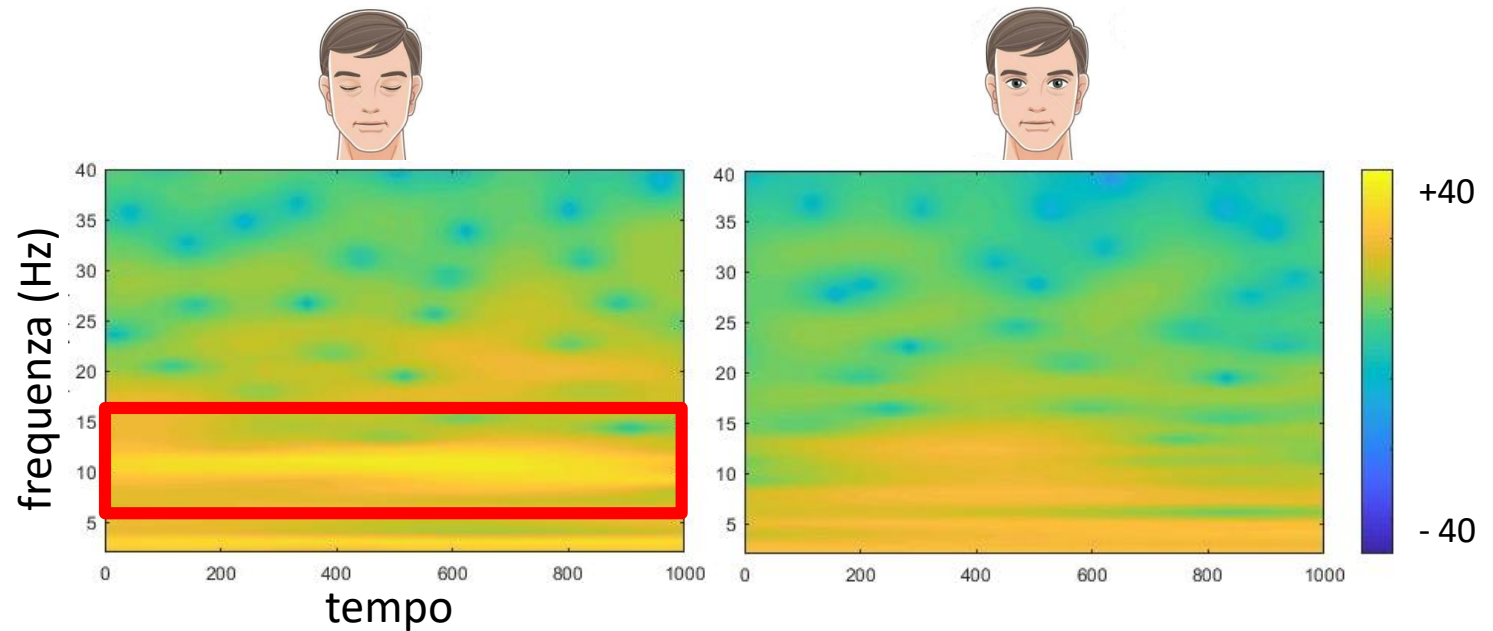


Esperimento 1

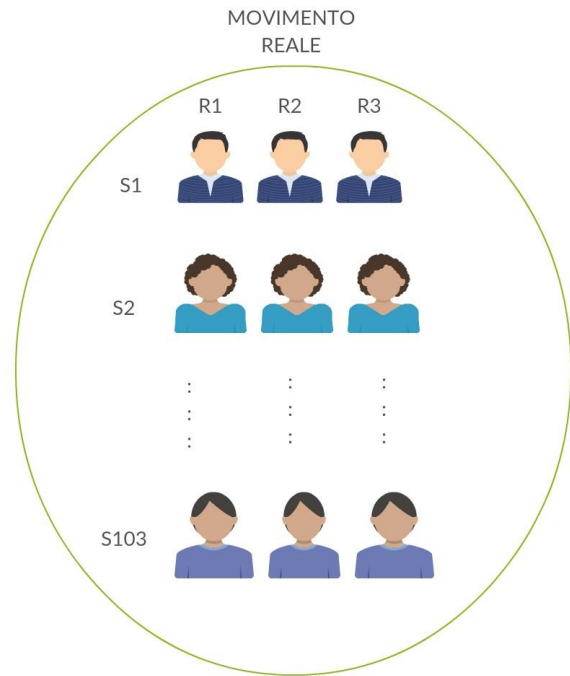


true class	0	1
0	94	15
1	16	93

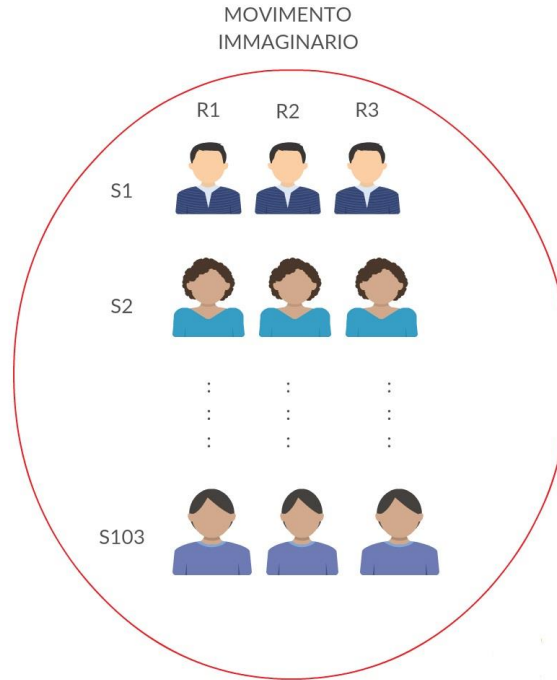
predicted class 0 1



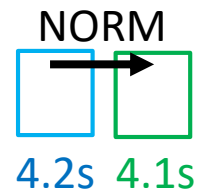
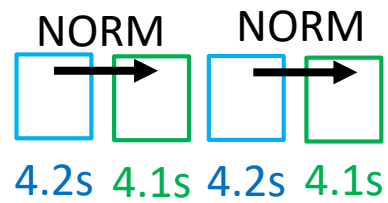
Esperimento 4



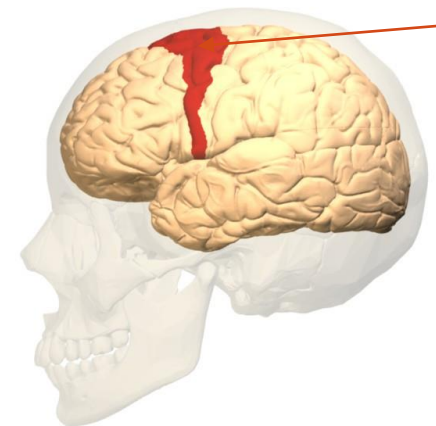
VS



TASK

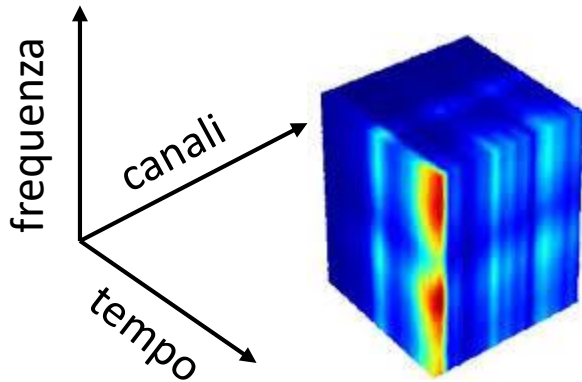
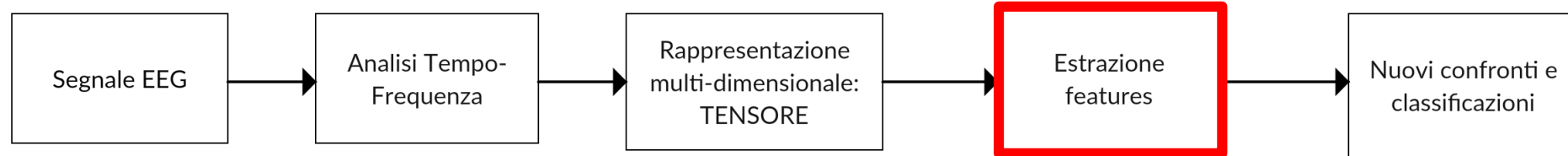


true class	0	1
	207	102
1	111	198
	0 predicted class	1



$P < 0.01$

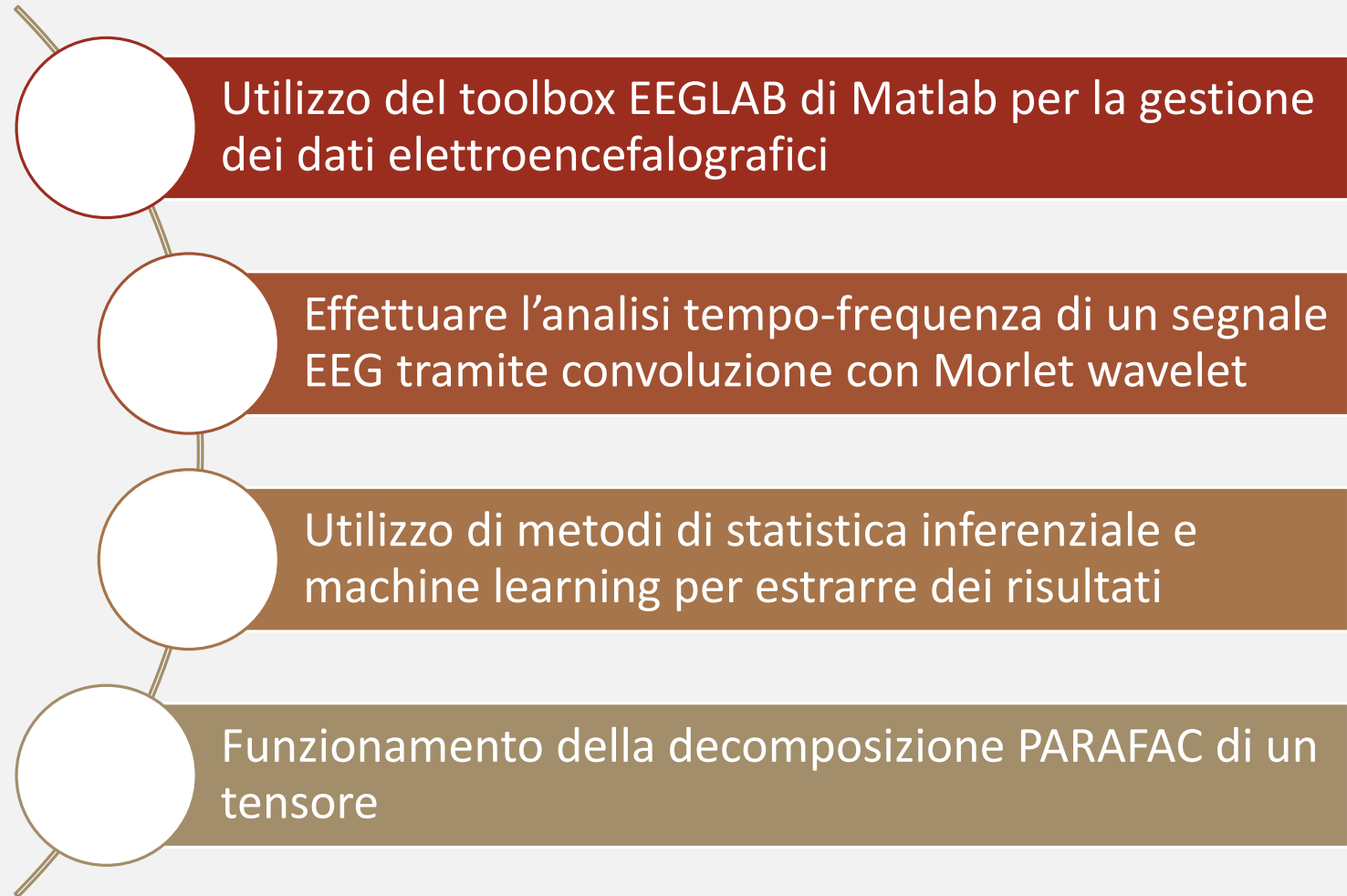
Future works . . .



$$\mathbf{Y}_{(I \times T \times Q)} = \mathbf{a}_1 \mathbf{c}_1 \mathbf{b}_1 + \dots + \mathbf{a}_j \mathbf{c}_j \mathbf{b}_j + \mathbf{E}_{(I \times T \times Q)}$$

Diagram illustrating the decomposition of the EEG tensor $\mathbf{Y}$ (dimensions $I \times T \times Q$) into a sum of rank-1 tensors and a residual tensor $\mathbf{E}$ (dimensions $I \times T \times Q$). The rank-1 tensors are formed by the outer product of vectors $\mathbf{a}_i$ (time), $\mathbf{c}_i$ (channels), and $\mathbf{b}_i$ (frequency).

COMPETENZE ACQUISITE



Grazie per l'attenzione . . .

ESPERIMENTO 2

	Prova 1	Prova 2	Prova 3	Prova 4
Accuracy	63.6%	61.2%	64.1%	62.6%
F-score	0.647	0.594	0.62	0.619

ESPERIMENTO 3

Canale	Theta	Alpha	Beta
1	0.0032	0.0914	0.2174
2	0.0027	0.0240	6.8432e-06
3	0.0252	0.0145	1.4179e-06
4	0.0335	0.0201	2.5284e-06
5	0.0270	0.0062	3.4288e-06
6	0.0261	7.4366e-04	1.3682e-05
7	0.0918	0.0927	0.1487
8	0.0127	0.1529	0.5631
9	0.0045	0.4000	6.3762e-05
10	0.0214	0.2203	2.0070e-05
11	0.1073	0.1085	0.0160
12	0.0556	0.0086	0.0042
13	0.0521	0.0029	0.0038
14	0.1898	0.0117	0.2162
15	0.0119	0.0343	0.0411
16	0.0091	0.0627	3.1286e-04
17	0.0307	0.0295	0.0053
18	0.0908	0.0261	0.0541
19	0.1325	0.0041	0.2032
20	0.0497	1.2345e-04	0.3815
21	0.1114	0.0086	0.6480
22	0.0020	0.1482	0.1886
23	0.0039	2.3953e-04	0.0220
24	0.0078	0.3382	0.4521
25	0.0667	0.3081	0.0640
26	0.0024	0.1472	0.0534
27	0.0041	0.0173	1.2457e-05
28	0.0037	0.4404	0.0941
29	0.0339	0.4893	0.2155
30	0.0044	0.8854	0.1997
31	3.5190e-04	0.2701	0.6467
32	0.0038	0.0058	0.0085

Canale	Theta	Alpha	Beta
33	0.0149	0.0048	9.6854e-06
34	0.0253	0.0161	3.5429e-06
35	0.0122	0.0322	3.3275e-07
36	0.0125	0.0406	6.9406e-06
37	0.0156	0.6157	0.0096
38	0.0598	0.0771	0.9904
39	0.0020	0.2398	0.0165
40	0.0165	0.1069	0.3057
41	0.1992	0.1065	0.5781
42	0.3354	0.3169	0.6504
43	0.3306	0.0658	0.0111
44	0.3760	0.6968	0.9991
45	0.0866	0.0192	0.8569
46	0.2949	5.7039e-04	0.0510
47	0.1485	5.7185e-04	0.2058
48	0.0034	6.6052e-04	0.0300
49	0.0088	5.2285e-04	0.0023
50	0.0322	0.0012	0.0062
51	0.0271	0.0017	0.0395
52	0.0137	2.7903e-05	0.0971
53	0.0084	1.4585e-06	0.1566
54	0.0354	1.1561e-05	0.1148
55	0.0274	2.8618e-04	0.0177
56	0.0062	0.0054	0.2246
57	0.0041	7.2048e-04	0.0631
58	0.0012	2.0578e-04	0.0423
59	0.0014	4.3449e-06	0.3669
60	0.0678	7.1910e-05	0.1603
61	0.0293	0.0058	0.5735
62	0.0185	0.0037	0.7327
63	5.3363e-04	1.8656e-04	0.7746
64	0.1374	0.9249	0.9008