

Biomarker, Precision Medicine & Drug Development

Homework - Academic Year 2023/2024

Investigating brain dopamine lateralization in Parkinson's Disease



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Biomarker, Precision Medicine & Drug Development

Introduction of PD



Parkinson's Disease (definition by ChatGPT)

Parkinson's disease is a **progressive neurodegenerative disorder** that **affects movement**. It is characterized by a variety of symptoms, including **tremors**, **stiffness**, **slow movement** (bradykinesia), and **impaired balance and coordination**.

The primary cause of Parkinson's disease is the **loss of dopamine-producing neurons** in a region of the brain called the **substantia nigra**. **Dopamine** is a **neurotransmitter** involved in **regulating movement**, and its **deficiency** leads to the **motor symptoms** associated with Parkinson's.

In addition to motor symptoms, Parkinson's disease can also cause non-motor symptoms such as **cognitive changes**, **mood disorders** (such as depression and anxiety), **sleep disturbances**, and **autonomic dysfunction** (problems with blood pressure regulation, digestion, and bladder function).

The exact cause of Parkinson's disease is not fully understood, but it is believed to involve a **combination of genetic and environmental factors**. While there is currently **no cure for Parkinson's disease**, **treatment options** are available to help **manage symptoms and improve quality of life**. These treatments may include **medications**, **physical therapy**, **occupational therapy**, **speech therapy**, and in some cases, **surgical interventions** such as deep brain stimulation.

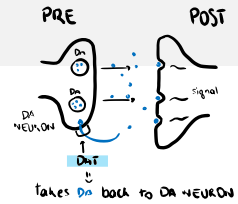
Parkinson's Disease (definition by APDA)

Parkinson's disease (PD) is a type of **neurologic movement disorder**, affecting the brain and causing difficulty with movements, or **motor symptoms**.

It is characterized by its most common motor symptoms — **tremors** (a form of rhythmic shaking), **stiffness** or rigidity of the muscles, and **slowness** of movement (called bradykinesia) — but also manifests in **non-motor symptoms** including sleep problems, constipation, anxiety, depression, and fatigue, among others, which can be present well before any visible motor symptoms. It is a **chronic and progressive condition**, meaning that the symptoms become **worse over time** and can **affect the ability to perform common, daily activities**.

<https://www.apdaparkinson.org/what-is-parkinsons/>

Rationale in brief: PD, DAT SPECT, brain asymmetry



- Parkinson's disease (PD) is characterised by the **degeneration of the nigrostriatal dopamine nerve**. => dopamine loss
- Dopamine transporter (DAT) ^{dopamine transporters} **single-photon emission computed tomography (SPECT)** is clinically used for **diagnosis of PD** as **biomarker for nigrostriatal dopamine degeneration**.
- Generally, the evaluation of DAT-SPECT images is conducted via **visual inspection**, frequently supported by **semi-quantitative indexes**. There is the need for **quantitative analysis** to **eliminate subjectivity and experience differences** among readers.
DIAGNOSIS of PD = DA loss
- **Asymmetric hemispheric loss of dopaminergic neurons** is one of the **characteristic features of Parkinson's disease (PD)** and could be used to support quantitative diagnostic.

Some References

<https://pubmed.ncbi.nlm.nih.gov/20019219/>

<https://pubmed.ncbi.nlm.nih.gov/34124799/>

Antonini

Outline of the homework

- The aim of the homework is to prepare a technical report that explores the value of left-right lateralization of dopamine function (if any) in Parkinson's disease using data from DAT SPECT imaging.

- **RESEARCH QUESTIONS:**

By using a dataset derived from PPMI study, this report should address the following questions:

PART 1 – Dopamine Brain Lateralisation in Healthy Controls

- Is dopamine function lateralised in healthy subjects? Is there any relevant covariate associated to dopamine function lateralisation?

↓
See if 1 applies to PD patients
from healthy

PART 2 – Dopamine Brain Lateralisation in PD

- Is dopamine function lateralised in PD patients? How is brain lateralisation associated to PD symptoms?

motor symptoms, sleep problems...

WORKFLOW

PREPROCESSING :

VARIABILI UTILI

- ✓ guardare var. riassuntive (4) → NORMALIZZARE
- ✓ LATERALIZZAZIONE = 3 variabili (left-right)
- ✓ variabili demografiche (escludere PRIMDIAG=97)
- ✓ stessi valori variabili (0/1 ↔ ON/OFF)
- ✓ analisi missing values (dove, categorie, quanti mancano)

- GESTIONE missing values :
 - togliere soggetti (righe)
 - togliere variabili (colonne)
 - (- interpolazione?)

MOTIVAZIONE X REPORT:
NON interpretabili x
mancanza di questa
informazione

assumptions → TEST → results

has to be INDEPENDENT

⇒ try to change assumptions
to see how solid the results are

IDEA: sottrarre HC dalla lateralizzazione?
tipo sottrarre baseline normale?

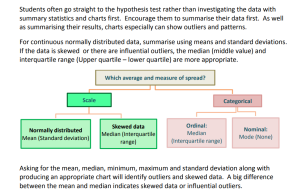
→ SPIEGARE BENE nel REPORT
perché si è scelto di
includere solo certe
Variabili

- ✓ escludere pazienti con lateralizzazione < 20%? → vd. articolo "Ipsilateral deficits..."

- analisi variabili importanti (mean, variance...) → capire distribuzioni

- FEATURE SELECTION (PCA, manual...?)

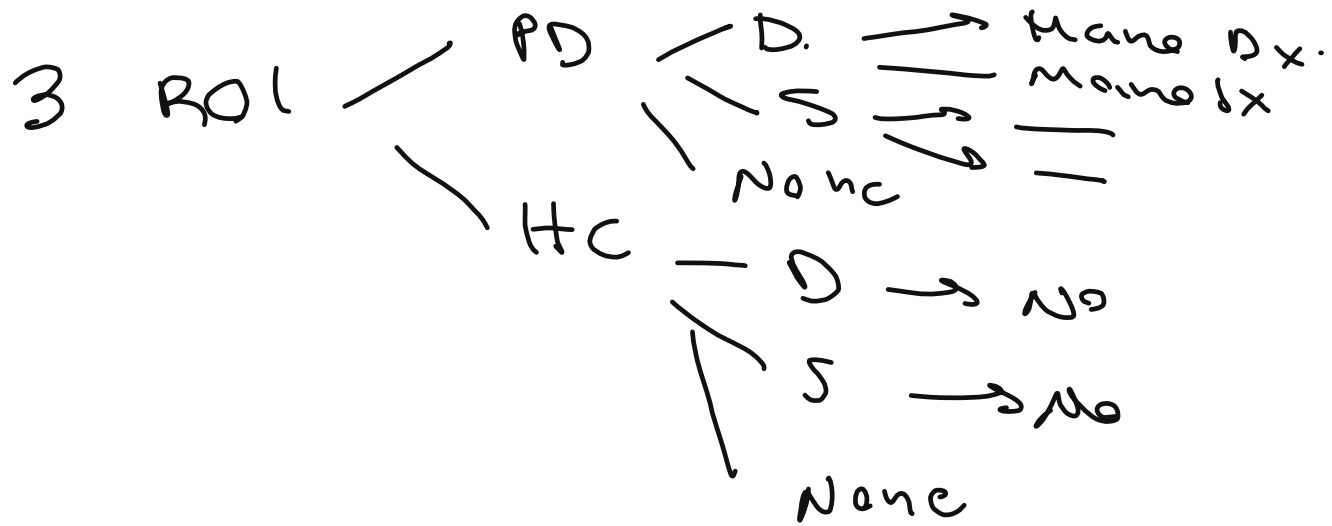
- preparare NUOVO DATASET fatto bene con SOLO le variabili e i soggetti che teniamo x analisi



1. Dopamine brain lateralisation in HC :
 - quanto/se è lateralizzata, in che regioni → □ TEST STATISTICI (kurtosis, skewness ...)
 - COVARIATES :
 - o regressione lineare
 - o matrici di correlazione
 - collegamento con uano dominante

→ [+ altre classi oltre PD : da unire, confronto risultato...]?

2. Dopamine brain lateralisation in PD
 - quanto/se è lateralizzata, in che regioni → □ TEST STATISTICI (kurtosis, skewness ...)
 - COVARIATES :
 - o regressione lineare
 - o matrici di correlazione
 - collegamento con uano dominante



LAT $D_x \rightarrow$ Mano Dx

LAS $S_x \rightarrow$ Mano Dx

1D

TEST STATISTICI

✓ **1-WAY ANOVA** → confronto media delle lateralizz. gruppi → H_0 : medie tutte uguali
considerando le varianze
(1 lat. alla volta)

Requisiti:

✓ **DISTRIBUZIONI GAUSSIANE** → Lillietest

- **VARIANZA** uguale per tutti i gruppi **NON SERVE**
→ ANOVA è ROBUSTO

- medie simili PD - HC \approx sono 0
- **VARIANZA PD molto + grande di HC**
- \Rightarrow dividendo RIGHT/LEFT lat. PD
non si può confrontare con HC
NON HANNO LATERALIZZAZIONE

N-WAY ANOVA → confronto 3 zone di lateralizzaz.
(considera relazioni tra variabili) → magari altre var.

SCATTER PLOT →
X → DATSCAN
Y → NPTOT...

CONFRONTO → LAT PD RIGHT/LEFT con (tutti) i sintomi

CORRELAZIONE / ANALISI lat. \leftrightarrow handed

VARIABILI:

PATNO → ID (si ripete?) ←

COHORT → HC
→ PD
→ SWEDD: no evidence of dop. deficit but PD diagnosis
→ PRODROMAL: onset of PD, before diagnosis

GENETICS → cercare

ETHNICITY

HANDED

EVENT_ID → ~~BASELINE~~: dopo screening, diagnosi effettiva
→ SCREENING: 1° visita x entrare in uno studio, poche misure
→ NA: non gli hanno fatto la domanda?

AGE

BIRTHDATE

SEX

ANYFAMPD → familiarità

PRIMDIAG → diagnosi primaria ⇒ modificata dopo **NEWDIAGEXP**

↳ da escludere "97" (SWEDD)

“ → diagnosi non cambia
NA → domanda non fatta

(**OTHNEURO** → other neurological pathologies: sono pochi, servono?)

(**DXLVL** → confidence diagnosi primaria → scartare CONFIDENZA BASE?)

(**SXDT** → data inizio sintomi)

(**PDDXDT** → data diagnosi PD)

DX - TREMOR

↑
diagnosi:

BRADY (bradykinesia)
POSINS (postural instab.)
OTHS
RICID (rigidity)

sintomi
PD diagnosis
history

0: No
1: YES
2: UNKNOWN

← se sono presenti già alla diagnosi

UPSIFORM → Versione
UPSIT_PRCNTGE → score

1: original
2: revised

UPSIT = smell identification test
(sintomo PD e AD)
(90%)

età
sesso

= domande
↓
punteggio

alla fine

SINTOMI

4 : severo



0 : normale

NP1SLP - N night } → SLEEP PROBLEMS
D day }

27

NP1PAIN → dolore

NP1URIN → urinary problems

NP1CNST → constipation

NP1LTHD → lightheadness standing

NP1FATG → stanchezza (fatigue)

NP1PTOT → somma punteggi sintomi

34

+101 : unable to rate

NP1COG → cognitive impairment

NP1HALL → allucinazioni, psicosi

NP1DPRS → depressione

NP1ANXS → ansia

NP1APAT → apatia

NP1DDS → features - dopamine dysregulation syndrome

malattia: dipendenza da farmaci x dopamina

NP1RTOT → somma punteggi sintomi
(tolto 101)

41

no 101

NP2SPCH → speech

NP2SALV → saliva + drooling

NP2SWAL → chewing + swallowing

NP2EAT → eating task

NP2DRES → vestirsi

NP2HYCN → igiene

NP2HWRT → hand writing

NP2HOBB → hobbies, activities

NP2TURN → turning in bed

NP2TRMR → tremori

NP2RISE → alzarsi

NP2FREZ → blocco camminata

NP2PTOT → somma punteggi sintomi

55

56

PDTRTMNT → treatment (0/1) → no effetto med.
~~PD STATE → functional state (ON/OFF)~~
 HRPOSTMED → ore tra medicina e esame
 ↓
 III parte test

PD MEDYN → prende medicine? (0/1) ?

DBSYN → ha DBS? DEEP BRAIN STIMULATION (0/1) .

intervento x ridurre sintomi motori PD

0 → 4 + 101

NP3SPCH → speech 61

NP3FACXP → facial expression

NP3RIG - N → neck
 - RU → right arm (?) ← indici RCHT
 - LU → left arm
 - RL → right leg (9)
 - LL → left leg

NP3FTAP - R → finger tapping right end } analisi (11)
 - L → finger tapping left end } ritmo

NP3HMOV - R → end movement right end (13)
 - L → end movement left end

NP3-PRSP - R } pronation/supination hand (15)
 - L }

- TTAP - R } toe tapping (17)
 - L }

- LGAG - R } leg agility (19)
 - L }

NP3RISING → from chair

NP3GAIT → walking

NP3FRZCT → freezing gait

NP3PSTBL → postural stability

95

DYSKPRES → dyskinesia (0/1)

DYSKIRAT → did movements interfere with rating

NHY → Hoehn & Yahr stage
 (0 → 4 + 101)

97

descriptive progressione PD sintomi

NP3POSTR → posture

NP3BRADY → bradykinesia

NP3PTRM - R } postural tremor hand (27)
 - L }

NP3KTRM - R } kinetic tremor hand (29)
 - L }

NP3RTA - R right } - U upper } (31, 33) E extremity
 - L left } - L lower }

REST
TREMOR
AMPLITUDE

NP3RTALJ → lip-jaw

NP3RTCON → consistency rest tremor

NP3TOT → somma punteggi

94

HAND $\begin{cases} R \\ L \\ \text{mix} \end{cases}$

LAT $\begin{cases} R \\ L \end{cases}$

SYMPTOM $\begin{cases} R \\ L \end{cases}$

0 → 4 + 101

98

104

NP4TOT → somma punteggi

possiamo togliere NP4
ma troppi NaN
e sono poche variabili
e generali

DATSCAN

— CAUDATE —R
—L

— PUTAMEN —R
—L

— PUTAMEN —R
—L } —ANT

NON HANNO
NAN

DATSCAN

DA TOGLIERE

0 : non compl.

1 : compl.

2 : compl. PRIMA → PREVDATDT (data)

VSINTRPT

→ visual interpretation
1 : consistent
2 : not consist.
3 : not provided

DATA } SCAN
ORA

DATA }
ORA

iniezione → DOSE

MECABEQUEREL
MBq → decay corrected
total dose
MCL → actual total dose

CONVERSIONE

QUALITY RATING

→ togliere BASSES

1 : buona
2 : ↓
3 : bassa

VSINTRPT

→ maggioranza interpretazione

positive } QUALITÀ
negative

↳ da escludere? ⇒ DAT_SCAN meno affidabili

HTCM → height (cm)

WTKG → weight (kg)

STARTDT → start date medication

LEVODOPA → dose ad ogni assunzione (unità?)

LEDD → medicina equivalente, dose giornaliera

MCATOT → MoCA total score : MAX=30, <26 = disfunzioni cognitive

(Montreal Cognitive Assessment) → early detection of mild cognitive impairment

PATIENT

??

Exam questions (what I expect to see in the report)

explain why it makes sense to explore asymmetry => see if someone has already done it => HYPOTHESIS: what do we expect to see also see which methods have already been used

- **Background** - To introduce the rationale of investigating brain dopamine function and potential brain asymmetry in PD.
- Main points to cover:
 - The literature evidences investigating brain (dopamine) laterization in PD
 - State the aims of the study, and based on literature evidences, formulate and motivate study hypotheses

Exam questions (what I expect to see in the report)

■ Material and Methods

Dataset

- Provide a **summary of the dataset** (refers to data files and [PPMI](#) portal). Please note that **only individual with baseline DAT imaging** where included.
 - The **main target regions** are Caudate and Putamen, quantified as **Signal Binding Ration** (i.e. DATSCAN_PUTAMEN_L/R and DATSCAN_CAUDATE_L/R)
- Handwritten notes and arrows:
- An arrow points from the word "baseline" in the first bullet point to the text: "intendono EVENT_ID = 'Screening' → non abbiamo INFATTI EVENT_ID = 'baseline'".
 - Another arrow points from the word "baseline" to the text: "↑ = un'unica acquisizione v paziente (NO FOLLOW-UP)".
 - An arrow points from the underlined text "DATSCAN_PUTAMEN_L/R" to the text: "2 ROIs".

Research methods

- Provide a description of the **methodology used to answer the research questions.**
- Provide an **extensive and motivated description of statistical analysis plan, including the metrics used to assess the biomarker performances**

Exam questions (what I expect to see in the report)

(ex paper = max 10 fig/tables)

■ Results

good selection of figures
and of which results to highlight

- A clear and concise description of the statistical results providing answers to the research questions
- A sensitivity analysis of the results to covariates, group matching and data quality (e.g. missing data, data miss-balance)

⇒ COMMENTING of results

has to be
= SELF-EXPLAINABLE

■ Discussion

≠ repetition of results

go question by question
using hypotheses

(In agreement with...
As expected...)

- Direct answers to the research questions
- An overview of the limitations of the study
- A list of possible suggestions to improve the study in case someone will repeat it in future

maybe missing data

Deliverables

Expected deliverables (i.e. what you have to submit) consist in

- A **technical report** (pdf file)
- A **zip folder** with all the **code** used to process the data and ancillary files (make sure it contains all the information for re-using it)

SUBMISSION RULES

- Max Four members per group [choose your team wisely]
- Submission date: Sunday 16th June at midnight

Marking: PROJECT REPORT MARKING GRID file

Element	Content	Maximum Mark
Abstract	<ul style="list-style-type: none"> • Summary of the work presented in the report (a summary figure is welcome) • Clarity of writing • Shows awareness of the limitations and significance of the work 	10
Background	<ul style="list-style-type: none"> • Clarity of statement of aims and hypothesis to be tested • Range and appropriateness of background material and/or references • Clarity of writing including presentation and organisation of material • Analysis and summary of background material 	15
Materials & Methods	<ul style="list-style-type: none"> • Correct description of materials and their sources (e.g. study sample etc.) • Clarity of description of methods and appropriate level of detail such that someone else could repeat the experiments or study • Correct statistical planning 	15
Results	<ul style="list-style-type: none"> • Results or data presented in a logical order and containing all the relevant information • Presentation of data including appropriate use of graphs/illustrations such as micro photographs with appropriate figure legends or statistical analysis with correct labelling in each case • Clarity of written description and of experimental work and results • Correct interpretation of findings 	30
Discussion	<ul style="list-style-type: none"> • Quality of conclusions drawn from the data • Comparison with the literature where appropriate, and appropriate referencing • Analysis and insight • Discussion of future work 	15
Figures	<ul style="list-style-type: none"> • Correct presentation • Quality and quantity • Relevance 	5
References	<ul style="list-style-type: none"> • Correct presentation • Quality and quantity • Relevance and recency 	5
Code	<ul style="list-style-type: none"> • Clarity of the code and presentation • Reproducibility 	5
		100