



Plasma steroidomics for diagnosis of primary aldosteronism

Georgiana Constantinescu, MD, MSc, PhD
Clinician Scientist
Dresden, Germany

ANAH
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Objectives

1. Clinical importance of steroid profiling
2. Interpretation of laboratory results and steroids in clinical scenarios




PRIMARY ALDOSTERONISM UNDERDIAGNOSED

4 -12% primary
care centres
(Käyser et al., 2016)

Lack of awareness
Difficulties of diagnosis

PA DIAGNOSIS

Transfagarasanu Road,
Romania



TREATMENT

Surgical



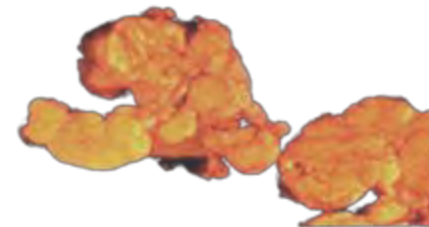
Aldosterone Producing Adenoma

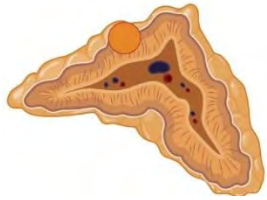


Mineralocorticoid Receptor Antagonists



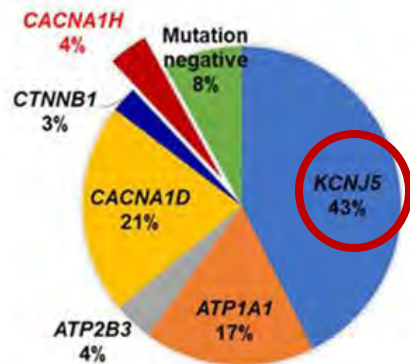
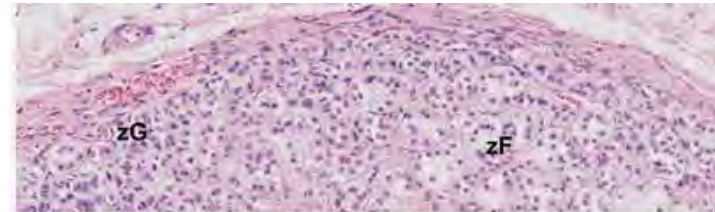
Aldosterone Producing Micronodule (APMs)
Aldosterone producing Diffuse Hyperplasia



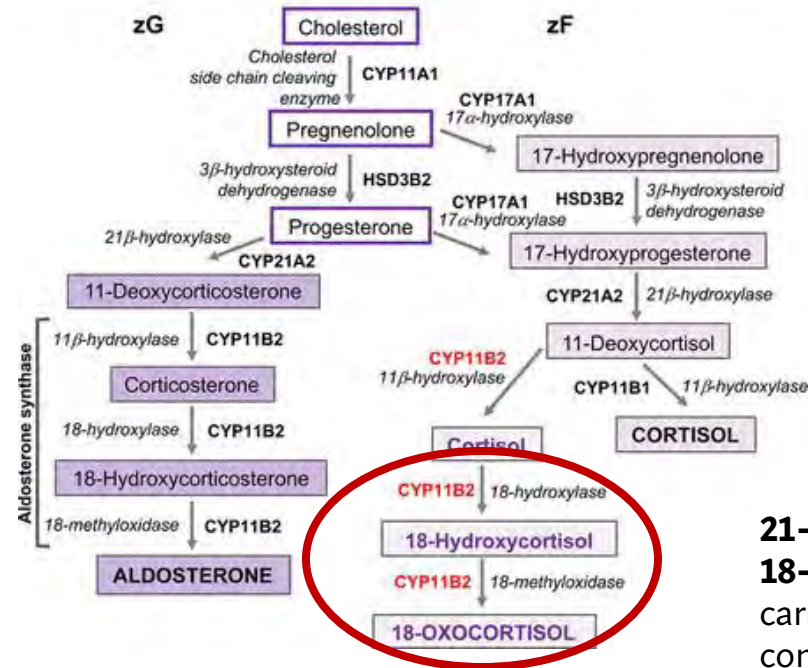


BACKGROUND

> 90% APAs harbor somatic mutations

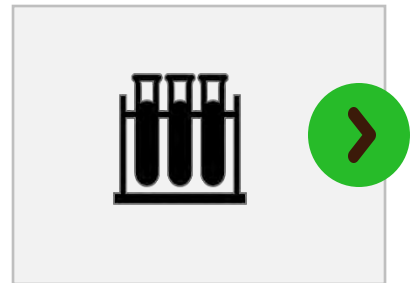
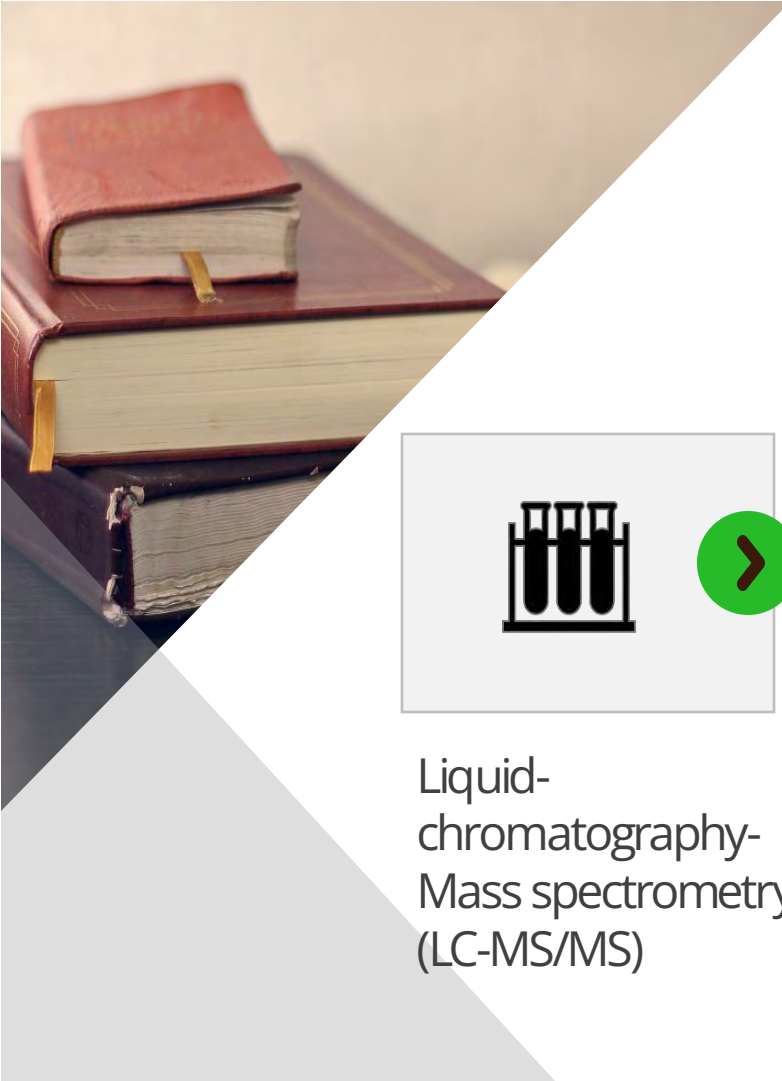


Mutation prevalence based on CYP11B2-guided APA analysis and targeted gene sequencing

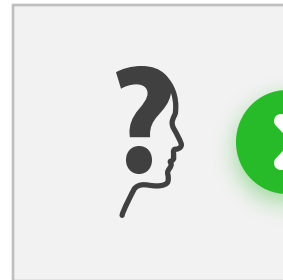


21-fold higher concentration of **18-oxocortisol** in APAs carrying **KCNJ5** mutations compared with the wild-type group

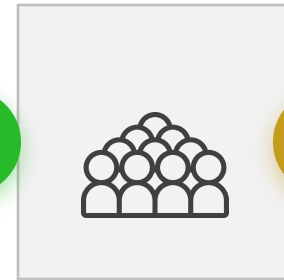
Integrating steroid profile into the diagnostic pathway



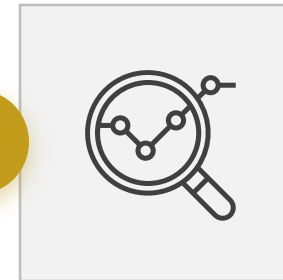
Liquid-chromatography-Mass spectrometry (LC-MS/MS)



Steroid profile



Machine learning



Redcap

Liquid Chromatography Mass Spectrometry based Steroid Profile

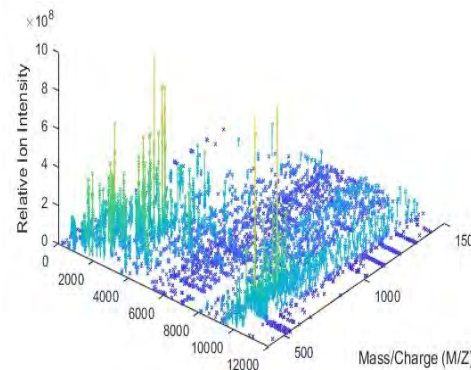
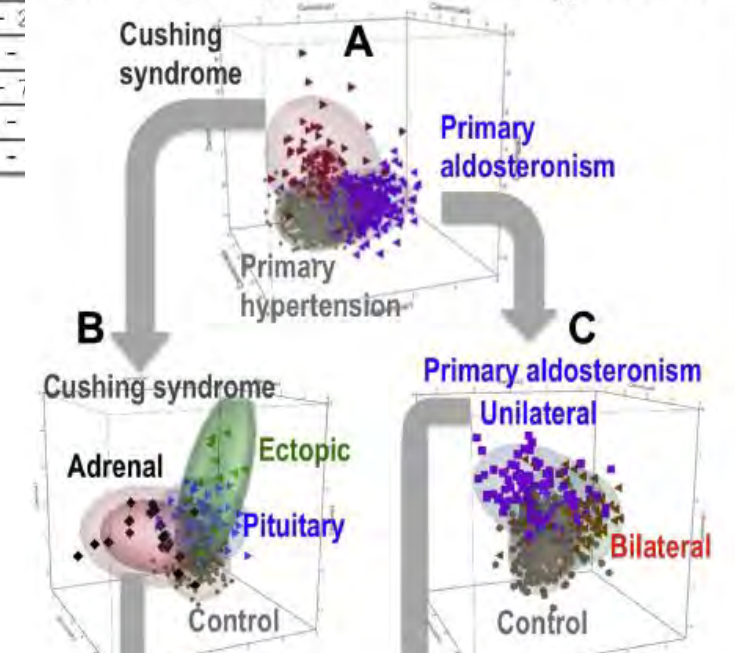


measurements of multiple analytes



Steroid	Value	Reference interval
Aldosterone	0.635	[0.020 - 0.670]
18-Oxocortisol	0.56	[NE - 0.090]
18-Hydroxycortisol	5.87	[0.41 - 3.4]
11-Deoxycorticosterone	0.23	[NE - 0.38]
Cortisone	31.9	[27.3 - 76]
11-Deoxycortisol	0.346	[0.110 -
Androstenedione	1.55	[1.07 -
Corticosterone	3.67	[1.71 -
DHEA	10.8	[2.8 - 2
DHEAS	4517	[1110 -
Cortisol	164	[121 - 7
17-Hydroxyprogesterone	0.63	[0.24 -
Testosterone	0.71	[0.30 -

Single plasma sample steroidomics
Patients with suspicion of endocrine hypertension



Machine Learning

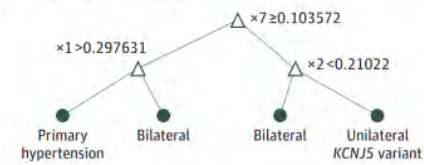
- ✓ analyze of multidimensional data
- ✓ recognition of patterns&relationship
- ✓ beyond measuring differences

=> Computational algorithms

Use of Steroid Profiling Combined With Machine Learning for Identification and Subtype Classification in Primary Aldosteronism

Graeme Eisenhofer, PhD; Claudio Durán, MS; Carlo Vittorio Cannistraci, PhD; Mirko Peltzsch, PhD; Tracy Ann Williams, PhD; Anna Riester, MD; Jacopo Burrello, MD; Fabrizio Buffolo, MD; Aleksander Prejbisz, MD; Felix Beuschlein, MD; Andrzej Januszewicz, MD; Paolo Mulatero, MD; Jacques W. M. Lenders, MD; Martin Reincke, MD

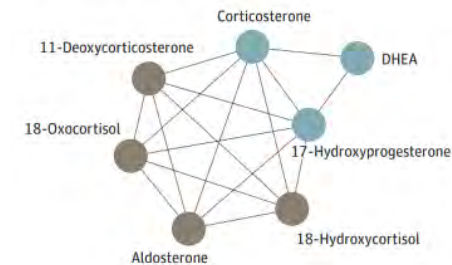
A Random forest model representation



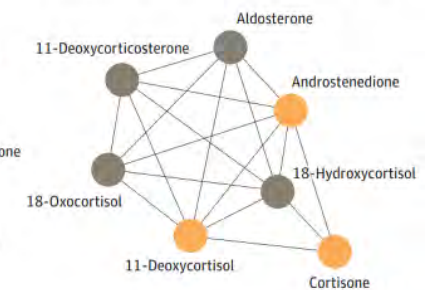
B Support vector machine model representation

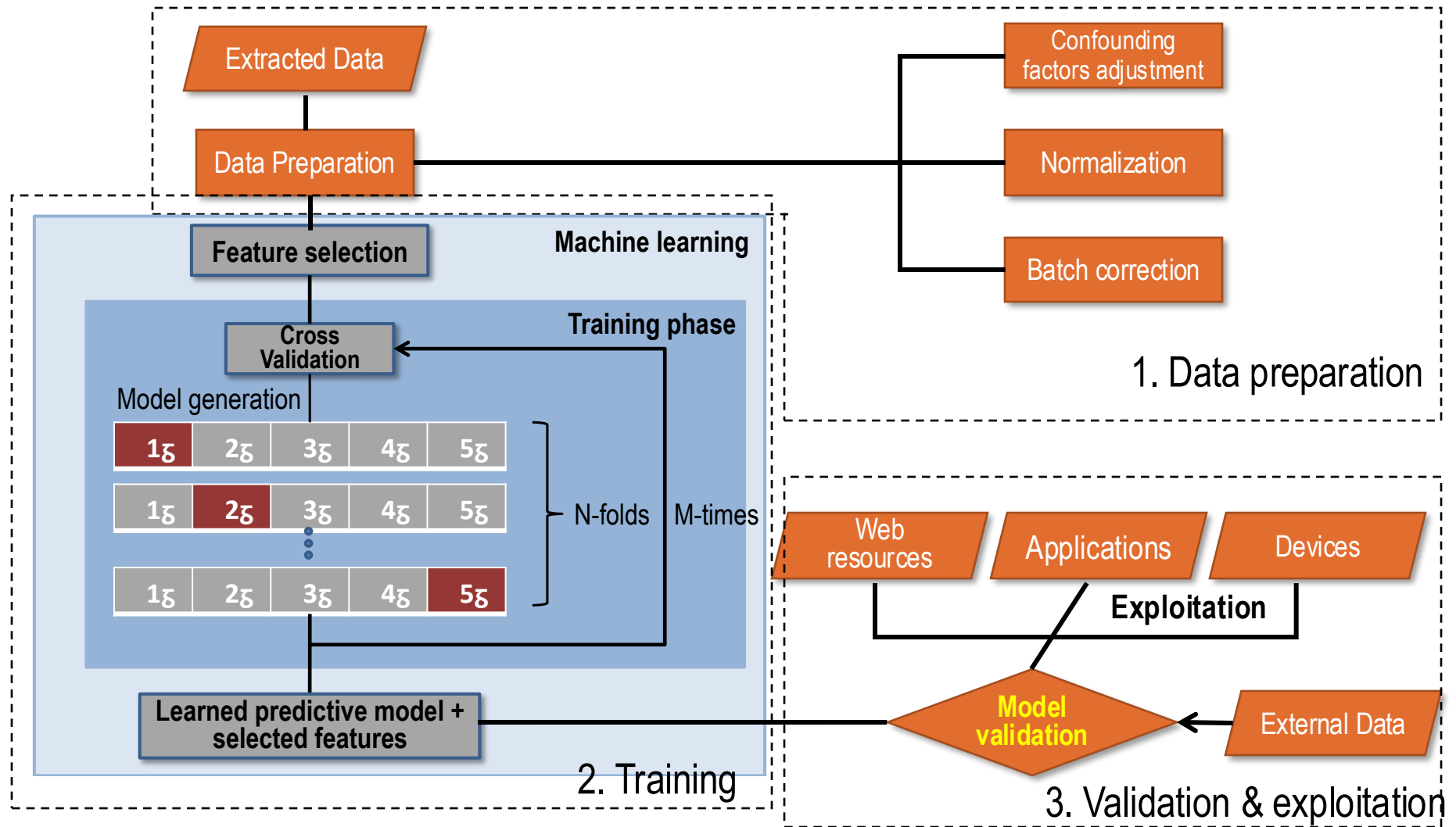
$$f(k, x) = \sum_{j=1}^n \alpha_{k,j} f_{j,k,j} G(\chi_{k,j}, X) + b$$

C Correlation network for random forest model



D Correlation network for support vector machine model





2. Interpretation of laboratory results and steroids in clinical scenarios



58-year-old female patient
Diagnosed with hypertension

24h BP Measurement 156/98mmHg,
HR 65b/min

- Daytime 159/100mmHg, HF 66/min
- Nighttime 148/91mmHg, HF 60b/min

Antihypertensive Therapy

Carvedilol 12.5mg

Amlodipin 5mg

Valsartan 160mg

Spirolacton 25mg

Levothyroxine 75ug

Sodium 141mmol/L

Potassium 3.48 mmol/L

Creatinine 58umol/L

Aldosterone 540pmol/L under non-interfering medication

Renin 1.9 pg/ml

Aldosterone/Renin Ratio (N<52) 284

PROSALDO – Prospective Study on the Diagnostic Value of Steroid Profiling in Primary **Aldo**steronism



Background:

- Genotype-specific steroid profiles associated with APAs
- Mass spectrometry-based adrenal and peripheral venous steroid profiling for subtyping primary aldosteronism

HYPOTHESIS:

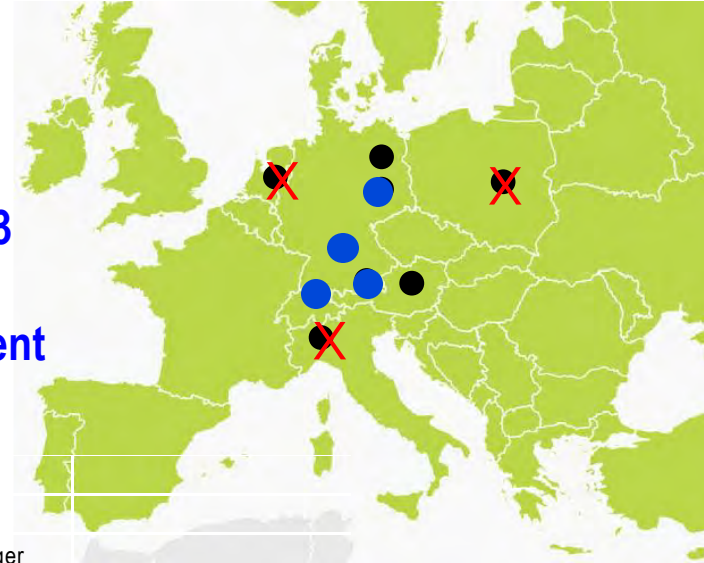
Can steroid profile be used to not only diagnose primary aldosteronism, but also differentiate unilateral APA due to KCNJ5 ?

International trial

- 10 Centers: Europe and Australia
- Centralized RedCAP data collection
- Centralized clinical decision support system
- Participating center technology transfer

Enrolment:

- **Start October 2019**
- **End December 2023**
- **844 patients**
- **Outcome assessment near finalized**



Dresden

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- Marko Poglitsch

Nijmegen

- Jacques Lenders

X COVID drop-outs or delayed starts
Six final recruitment centers

Patient flow through PROSALDO

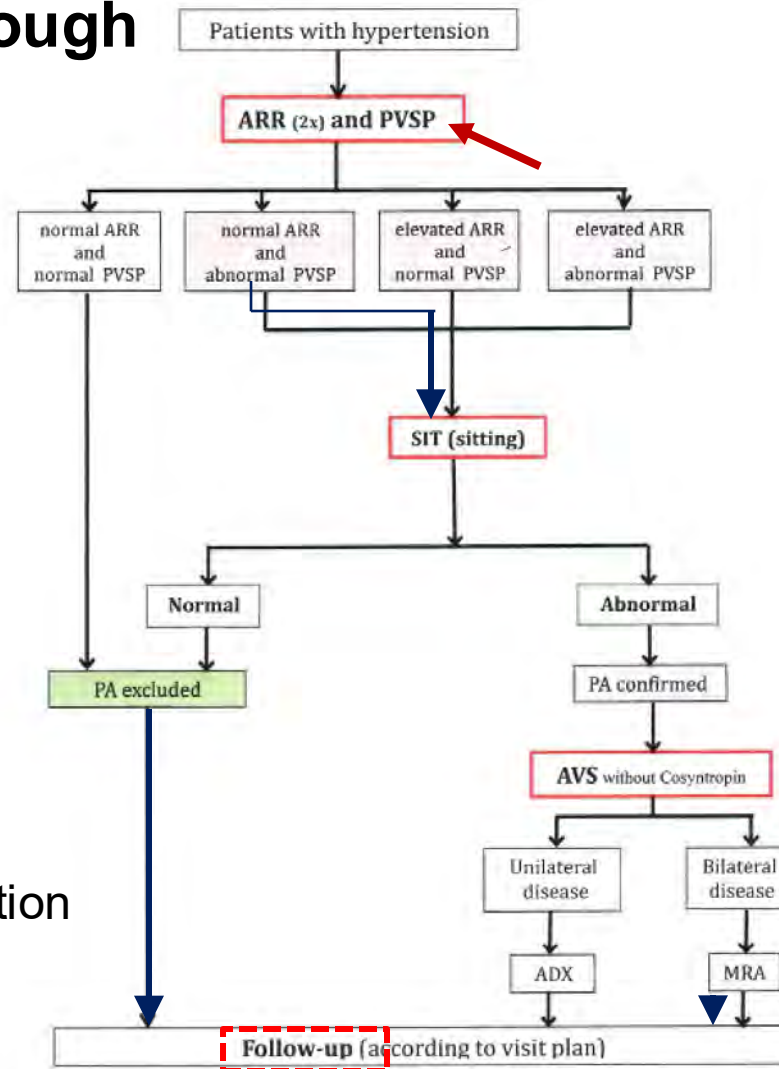
Screening

Confirmation

Subtyping - AVS

Therapeutic intervention

Follow-up



Study ID	GYDR-0694	Sex	Female	Age	58
Sample date	2020-03-12	Report date	2020-05-20	Contact	C

All values in nmol/l. NE: Not established. BLD: Below level of detection. VM: Varies with menstrual cycle. See below for details. **Below cut-off**. **Above cut-off**.

Steroid	Value	Reference interval
Aldosterone	0.227	[0.020 - 0.670]
18-Oxocortisol	0.489	[NE - 0.090]
18-Hydroxycortisol	6.43	[0.41 - 3.4]
11-Deoxycorticosterone	0.166	[NE - 0.321]
Cortisone	38.5	[24.2 - 67.6]
11-Deoxycortisol	1.4	[0.110 - 1.690]
Androstenedione	2.9	[0.74 - 5.22]
Corticosterone	11	[1.62 - 17.89]
DHEA	13.9	[1.9 - 19.9]
DHEAS	3351	[835 - 6371]
Cortisol	488	[121 - 700]
17-Hydroxyprogesterone	1.33	[0.24 - VM]
Testosterone	0.6	[0.30 - 2.30]

Machine Learning Results

Probability in %	Model 1 (LDA)	Model 2 (SVM)	Model 3 (RF)
Primary hypertension	1.2	4.91	3
Bilateral	0.6	7.49	10.2
Unilateral	0.9	20.23	35
Unilateral w/ KCNJ5	97.3	67.37	51.8
PA	98.8	95.1	97

KCNJ5 mutation at mean probability 78.5%

3 out of 3 machine learning models indicate primary aldosteronism for this steroid profile with a mean probability of 97 %. (PHT mean probability: 3 %)

Under the assumption of PA the mean probability of unilateral disease (93.7 %) is higher than for bilateral disease (6.3 %).
Under the assumption of unilateral disease this is likely to involve a KCNJ5 mutation at a mean probability of 78.5 %.

Salt loading test

Study ID	GYDR-	Sex	Female	Age	58
Sample date	2020-03-17	Report date	2020-05-26	Contact	

All values in nmol/l. NE: Not established. BLD: Below level of detection. VM: Varies with menstrual cycle. See below for details. **Below cut-off**. **Above cut-off**.

Steroid	Baseline value	4 hour value	Baseline reference interval
Aldosterone	0.305	0.449	[0.020 - 0.670]
18-Oxocortisol	0.444	0.638	[NE - 0.090]
18-Hydroxycortisol	5.79	5.41	[0.41 - 3.4]
11-Deoxycorticosterone	0.188	0.148	[NE - 0.321]
Cortisone	39.7	38.1	[24.2 - 67.6]
11-Deoxycortisol	0.404	0.932	[0.110 - 1.690]
Androstenedione	1.65	2.2	[0.74 - 5.22]
Corticosterone	4.31	4.43	[1.62 - 17.89]
DHEA	7.4	12.7	[1.9 - 19.9]
DHEAS	2618	2530	[835 - 6370]
Cortisol	241	199	[121 - 700]
17-Hydroxyprogesterone	0.77	0.61	[0.24 - VM]
Testosterone	0.5	0.49	[0.30 - 2.30]

Post SIT profile interpretation

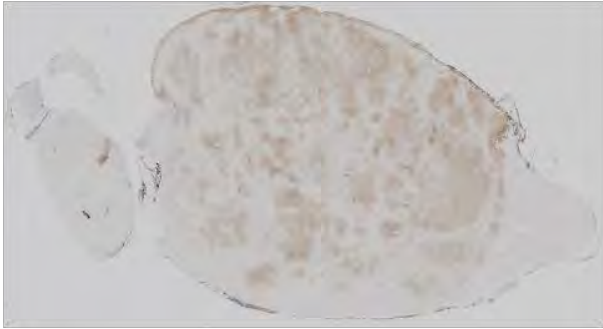
Aldosterone remains above the designated cut-off of 58 ng/l (162 pmol/l) after the SIT. Aldosterone shows no suppression compared to baseline.

Selectivity, Lateralization, Suppression

Steroid	Right adrenal vein	Left adrenal vein
Selectivity		
Cortisol SI	4.073507	3.375984
11-Deoxycortisol SI	46.301471	11.955626
Androstenedione SI	26.149533	24.947276
DHEA SI	18.517996	22.694761
Lateralization		
Aldosterone / Cortisol	0.001612	0.000271
Aldosterone / 11-Deoxycortisol	0.056217	0.014714
Aldosterone / Androstenedione	0.050608	0.00782
Aldosterone / DHEA	0.014187	0.001412
Cortisol LI	5.95	
11-Deoxycortisol LI	3.82	
Androstenedione LI	6.47	
DHEA LI	10.05	
Contralateral Suppression Index (Cortisol)	0.447224	

Sampling of the right adrenal vein has been selective (based on SI values of cortisol and / or AVSP panel). Sampling of the left adrenal vein has been selective (based on SI values of cortisol and / or AVSP panel). AVS has been selective. Lateralization can be determined. Lateralized: right (based on cortisol LI and AVSP panel LI)

Right adrenalectomy



adenoma
heterogeneous CYP11B2
immunostaining typical of an
APA *KCNJ5*⁺



KCNJ5⁺
a small peak for a G151R PV

Clinical case presentation

46-year-old male

hypertension

hypokalemia

incidentaloma

office BP 156/109mmHg

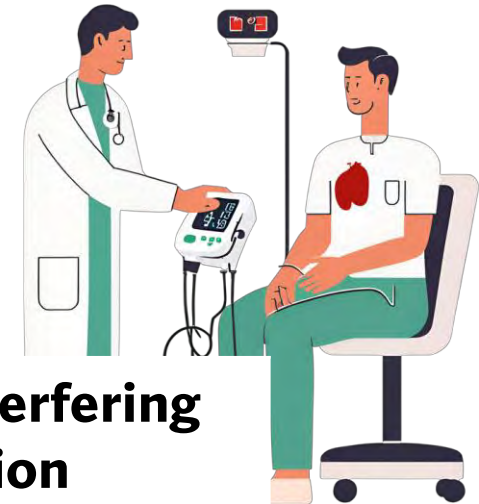
BMI 27.8Kg/m²

normal renal function

plasma K 3.6 mmol/L

Treatment

- Spironolactone 100mg
- Urapidil 60mg
- Lercanidipine 10 mg
 - Calcium Channel Blocker+
- Potassium Supplementation



With interfering medication

Aldosterone (pmol/L) 1260

Direct renin (mU/L) 26.1

ARR (N<52pmol/l/mU/L) 48.3

After medication adjustment

Verapamil 240mg
Urapidil 120 mg
Potassium supplementation

With non-interfering medication

Aldosterone (pmol/L)	2947
Direct renin (mU/L)	1.8
ARR (N<52pmol/l/mU/L)	1637



Diagnostic & Outcome

non-suppressed plasma aldosterone level

- **5254 pmol/L** (189 ng/dL) (N<169 pmol/L)

CT scan left adrenal (25x21x23 mm), 10 HU

adrenal venous sampling

- lateralization to the left with an index of >90.5
- contralateral suppression

adrenalectomy

left APA

KCNJ5 positive

outcome assessment

- biochemical and clinical cure



Interfering medication

PROSALDO SCREENING STEROID PROFILE REPORT

Study ID	GYDR-0777	Sex	Male	Age	46
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All values in nmol/l. NE: Not established. BLD: Below level of detection. See below for **Below cut-off**. **Above cut-off**.

Steroid	Value	Reference interval
Aldosterone	0.424	[0.010 - 0.450]
18-Oxocortisol	1.27	[NE - 0.100]
18-Hydroxycortisol	23.03	[0.74 - 4.64]
11-Deoxycorticosterone	0.303	[NE - 0.37]

Machine Learning Results

Probability in %	Model 1 (LDA)	Model 2 (SVM)	Model 3 (RF)
Primary hypertension		1.35	2.4
Bilateral	0.1	1.75	4.8
Unilateral	0.8	28.86	31.8
Unilateral w/ KCNJ5	99.2	68.03	61
PA	100.1	98.6	97.6

Mean probability 98.7%

Non-interfering medication

PROSALDO SCREENING 2ND STEROID PROFILE REPORT

Study ID	GYDR-0777	Sex	Male	Age	46
----------	-----------	-----	------	-----	----

Steroid	Value	Reference interval
Aldosterone	1.961	[0.010 - 0.450]
18-Oxocortisol	1.413	[NE - 0.100]
18-Hydroxycortisol	33.86	[0.74 - 4.64]
11-Deoxycorticosterone	0.993	[NE - 0.37]
Cortisone	51	[30.8 - 86.4]
11-Deoxycortisol	3.267	[0.130 - 2.580]

Machine Learning Results

Probability in %	Model 1 (LDA)	Model 2 (SVM)	Model 3 (RF)
Primary hypertension	0	0.34	0
Bilateral	0	1.32	8.6
Unilateral	1	27.14	27.6
Unilateral w/ KCNJ5	99	71.21	63.8
PA	100	99.7	100

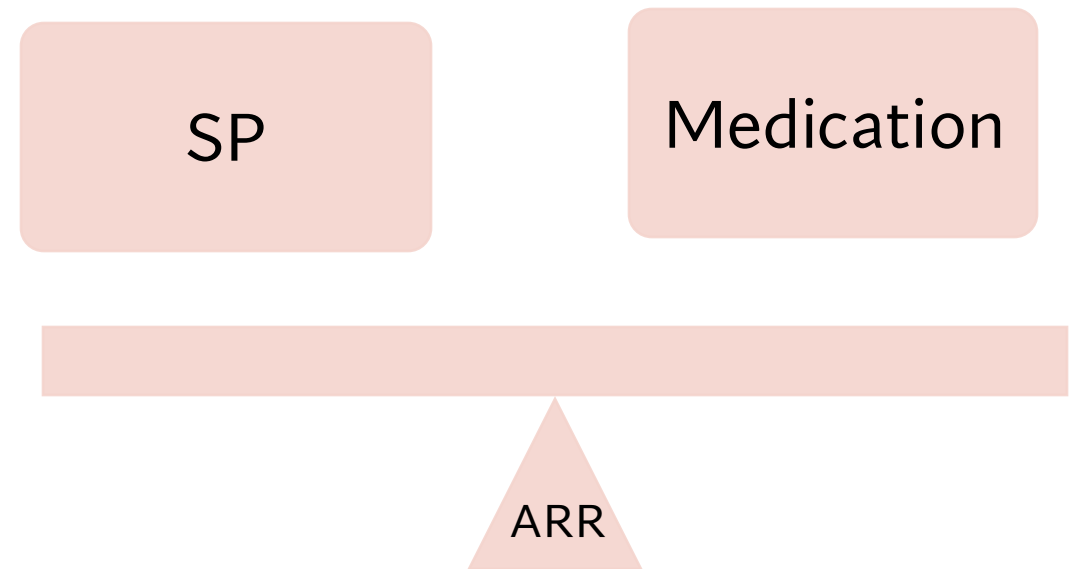
Mean probability 99.9%

Hypothesis

Interfering antihypertensive medication has a

minimal impact on

Machine Learning Based Steroid Probability Scores while the impact on the ARR is more important



ARR

CHARACTERISTICS AND BIOCHEMICAL TEST RESULTS

Patient demographics, blood pressure (BP) & heart rate

	Primary aldosteronism	No primary aldosteronism	
N	190	578	
Sex (F/M)	81/109	316/262	0.0044
Age (years)	51 (42-58)	50 (40-59)	0.3801
Systolic BP	156 (142-169)	151 (139-165)	0.0545
Diastolic BP (mmHg)	98 (88-106)	95 (87-105)	0.0722
Heart rate (bpm)	74 (67-85)	76 (67-86)	0.778

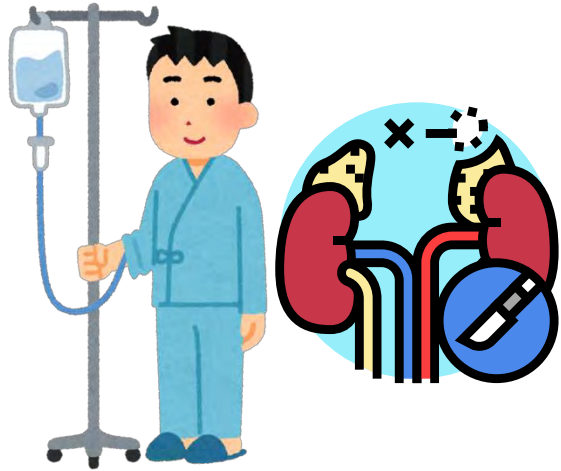
Biochemical test results

Aldosterone (pmol/L)	542 (345-808)	200 (130-298)	0.0001
18-Oxocortisol (pmol/L)	104 (52-432)	40 (27-64)	0.0001
18-Hydroxycortisol (pmol/L)	2578 (1692-5170)	1643 (1213-2248)	0.0001
Steroid probability score (%)	71.9 (48.8-92.8)	22.6 (15.3-33.2)	0.0001
Renin (mU/L)	4.2 (2.3-8.9)	10.5 (4.8-22.9)	0.0001
ARR (pmol/mU)	120 (64-243)	20 (8-45)	0.0001

Data for continuous variables are presented as medians with interquartiles in parentheses.

Patients with PA

Patients with adrenalectomy



**PA surgical outcome criteria (PASO)
immunohistochemical findings of an
aldosterone producing adenoma**

Patients under treatment



**screening (positive ARR/positive SP)
positive confirmatory testing
outcome assessment
(SIT at outcome assessment)**



Data analysis

Patients with and without PA were examined with and without interfering medications

multivariable analysis

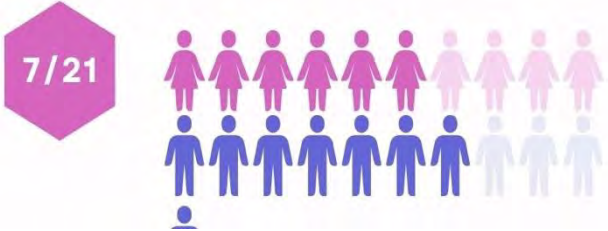
paired analysis

Receiver operating characteristic (ROC) curves for *ARR*

machine learning based steroid probability scores

PATIENTS WITH PA

FALSE NEGATIVE ARR  ARR < 52 pmol/mU



MRA

33%




ACE Inhibitor

60%

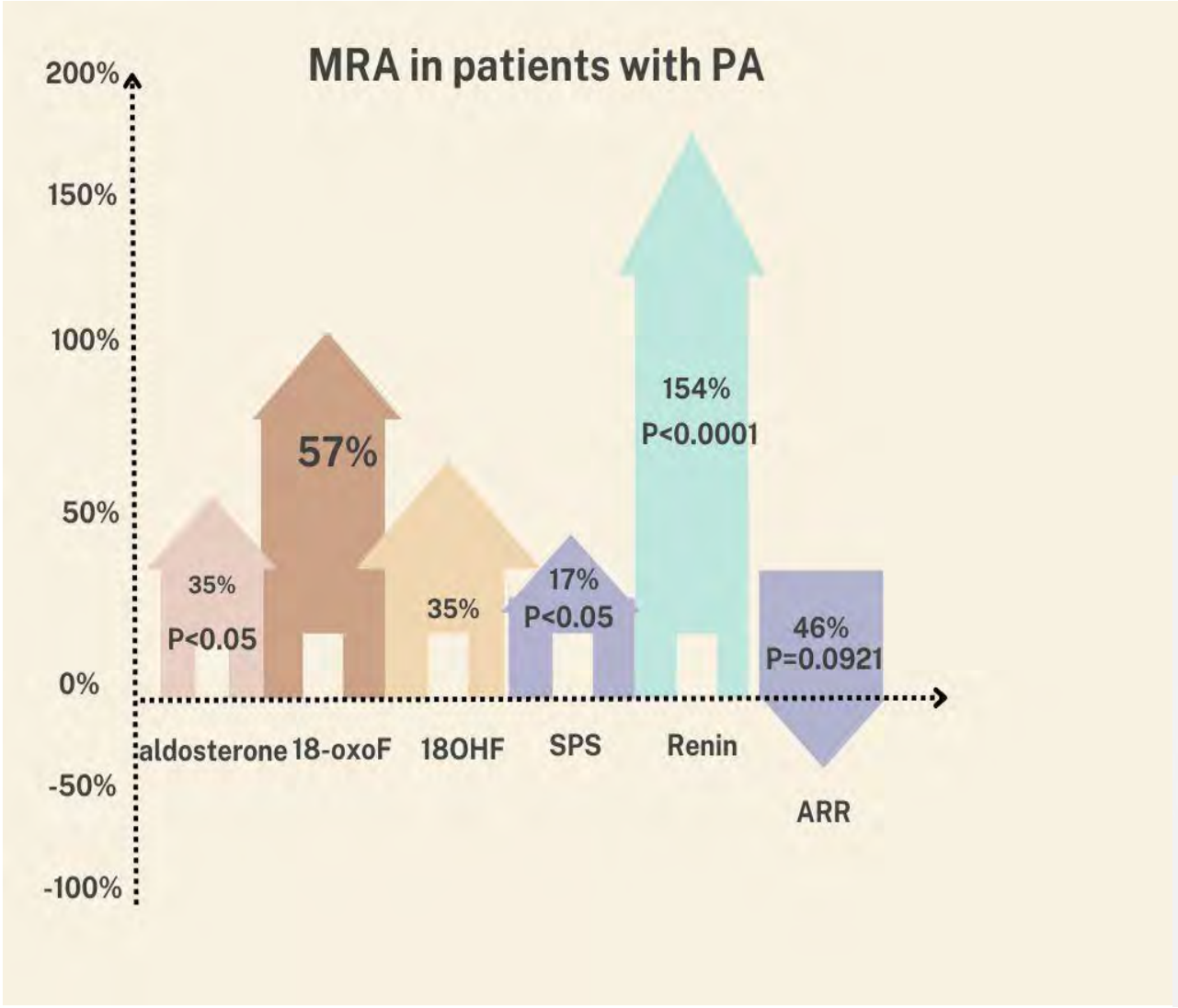


ARB

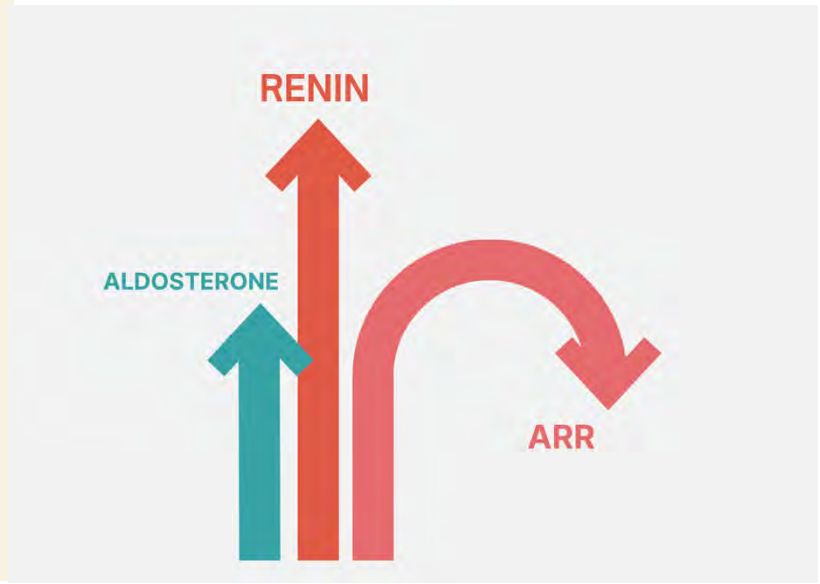
 ARR from 575pmol/mU
21 pmol/mU

50%

paired analysis of impacts of antihypertensive drugs



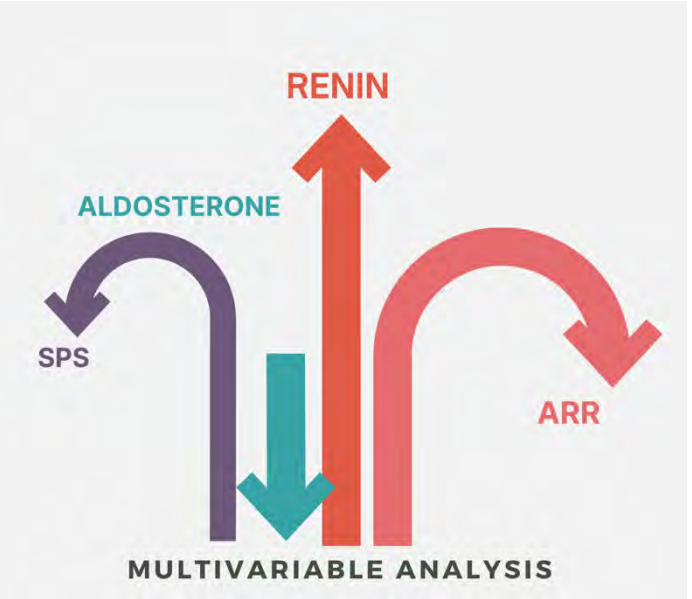
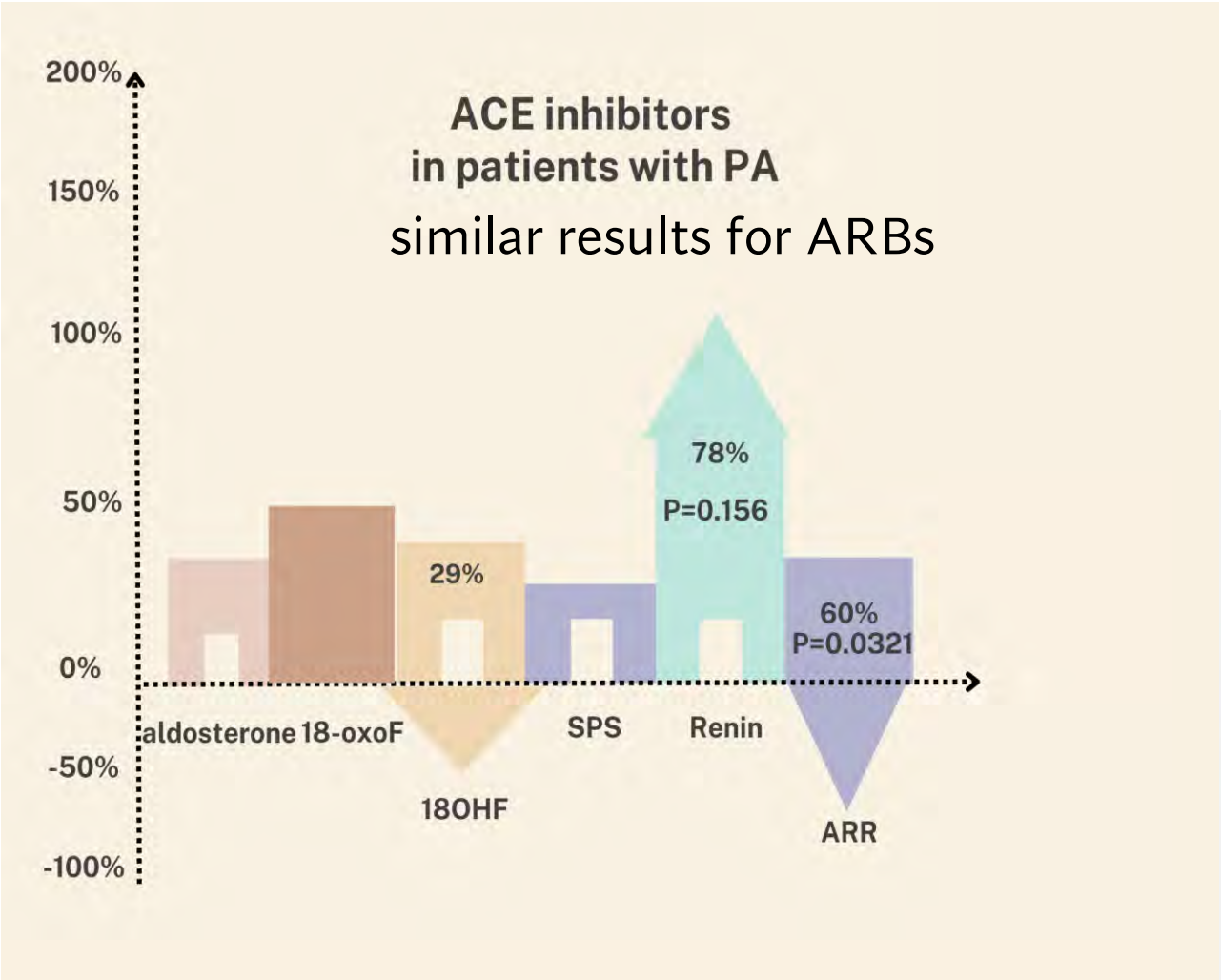
! MRA should be avoided



paired analysis

P < 0.05 significance of changes by Wilcoxon's paired comparison

multivariable analysis



paired analysis
 P <0.05 significance of changes by Wilcoxon's paired comparison

Patients with PA

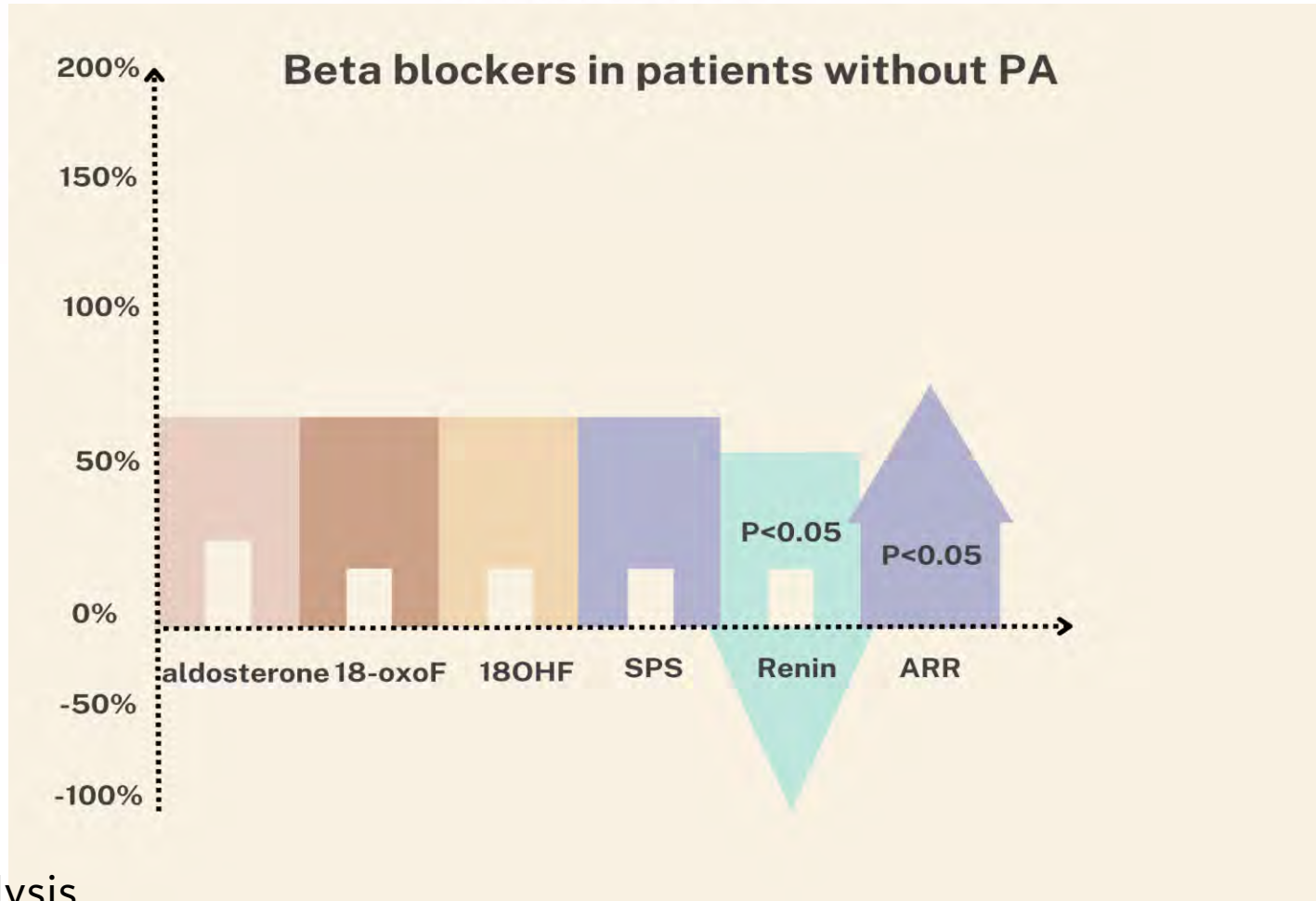
▶ without significant impact on any variables



MULTIVARIABLE ANALYSIS

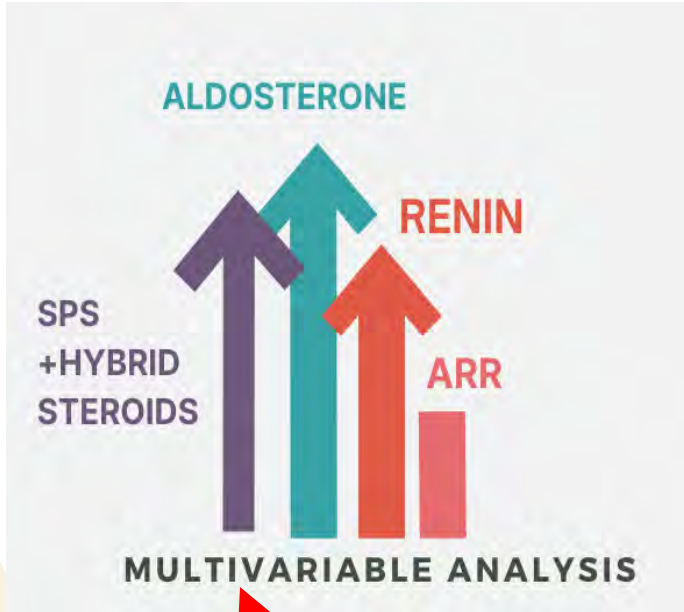
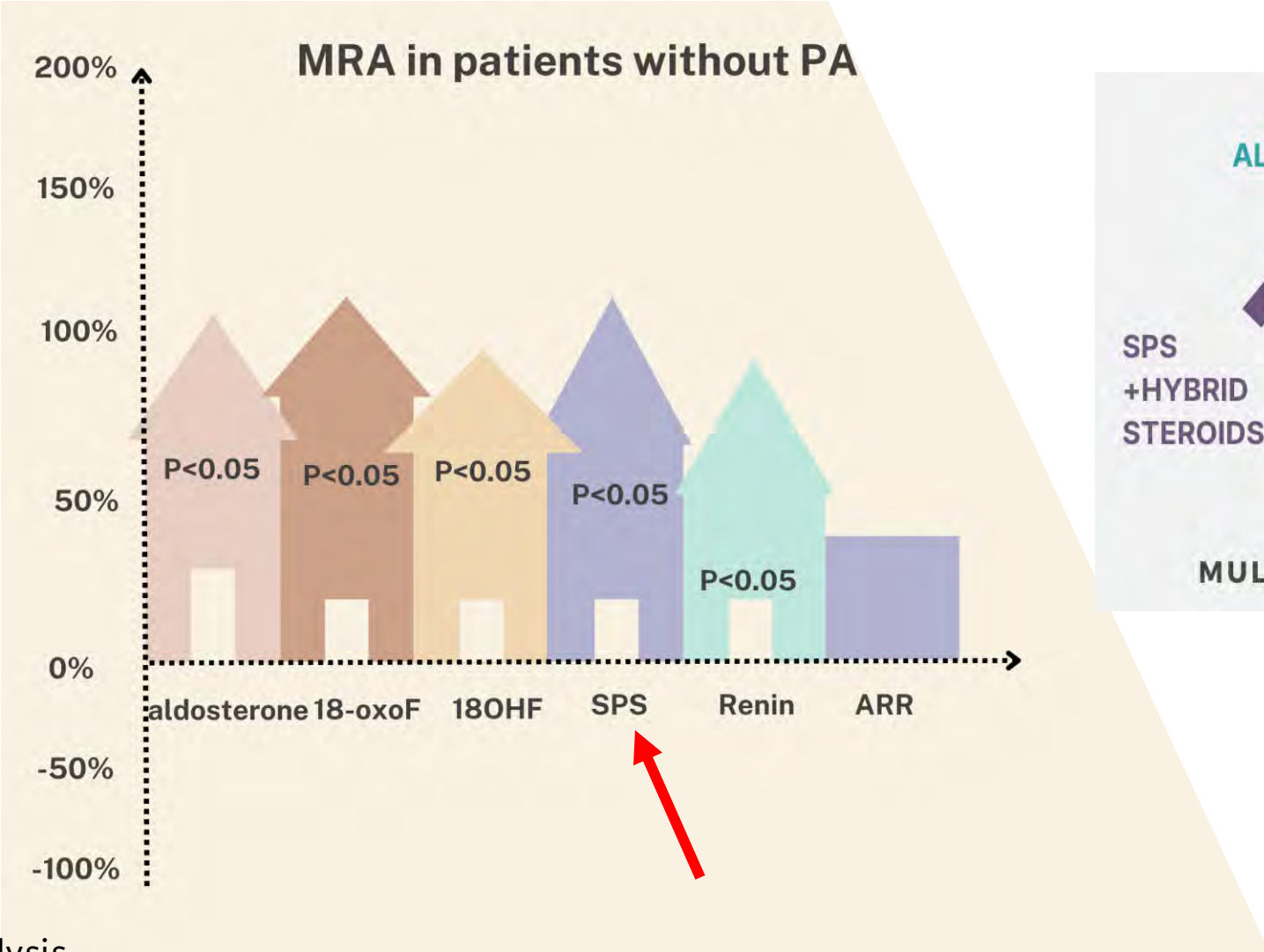
PATIENTS WITHOUT PA

FALSE POSITIVE ARR



paired analysis

P < 0.05 significance of changes by Wilcoxon's paired comparison

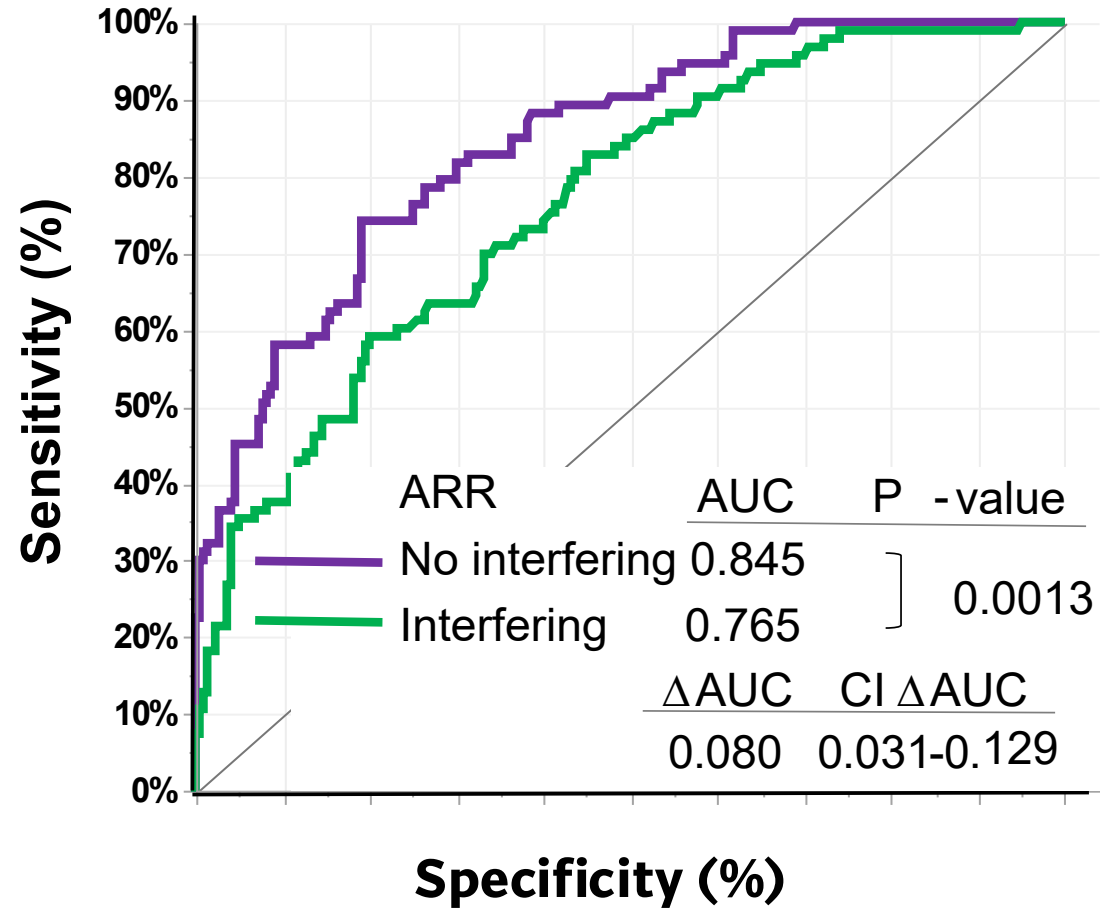


paired analysis

P < 0.05 significance of changes by Wilcoxon's paired comparison

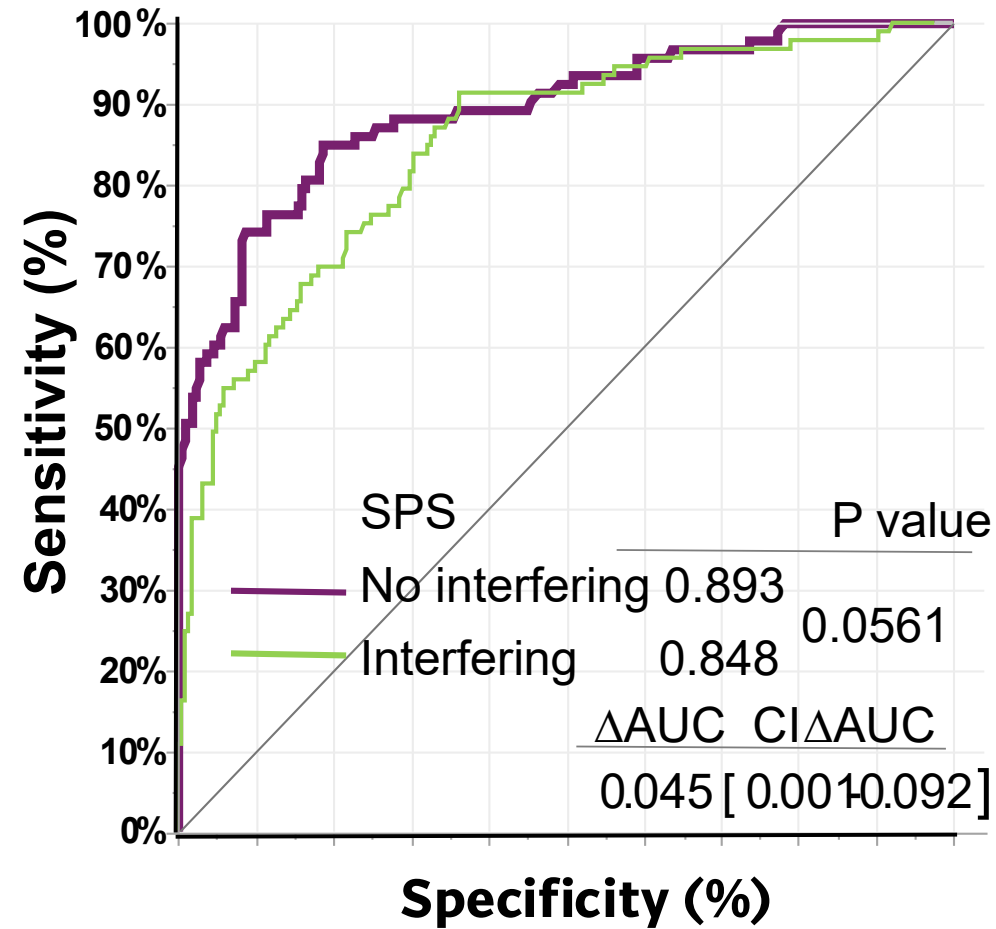
ARR

Interfering medication has an impact on AUC, lowering it



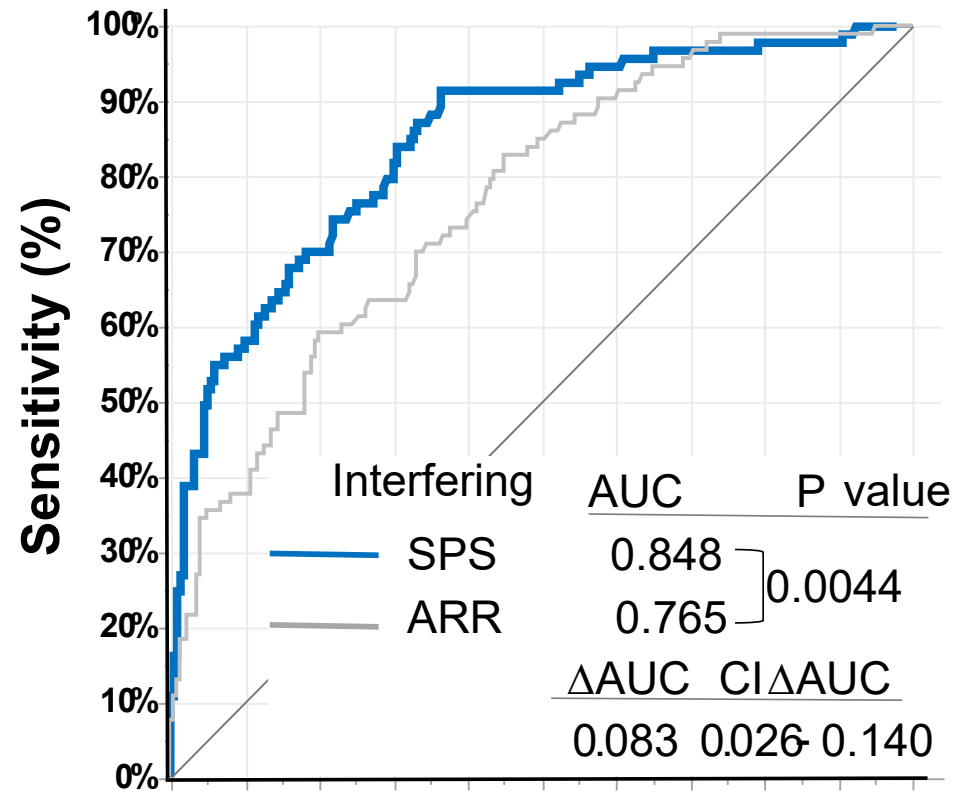
STEROID PROBABILITY SCORES

No difference in the ROC curves with and without medication



Steroid profiling vs ARR

Under interfering medication
SP shows higher AUC than ARR



Take home messages

- steroid profiling is a promising, complementary tool for improving the diagnosis of primary aldosteronism
 - integration with clinical, biochemical and imaging findings ensures accurate diagnosis
 - limited availability to several centers
 - validation in the clinical practice is necessary through further randomized clinical trials
-

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- | Jacques WM Lenders



ADRENAL RESEARCH CRC/TRR 205
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