



**BARDENA**

**Juan Cruz Cigudosa**

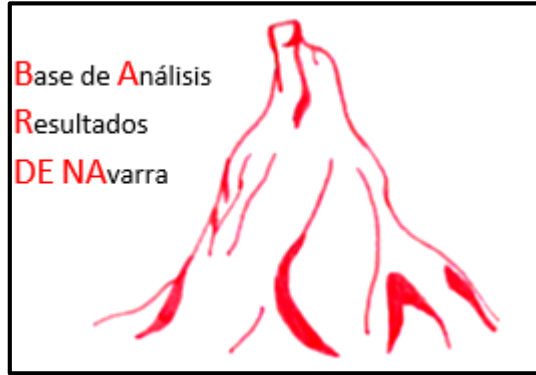
Navarra Government Minister for the area of University,  
Innovation and Digital Transformation

# Mission

- The **mission** of the Results Analytical Data Base of Navarra (**BARDENA**) is to allow the Evaluation of Health Performance Indicators, providing the Navarra Public Health System (SNS-O) with the autonomy and tools to exploit them.
- The **main objective** is to improve the yield of the work of health professionals by making available curated data that may be use to evaluate their performance, to detecti PDCA cycles and to facilitate work by processes, as well as collaborating in research and innovation.
- For this, the Integrated Database **BARDENA** has been created, a data lake that:
  - ✓ covers a complete and well defined population (homogeneously and universally covered with a single centralized public heath system) and
  - ✓ allows a quality data collection and a series of processes to optimize its use.

# Vision & Values

- Maximum requirements of quality of the data
- Compliance with the legislation (GDPR) , with special mention to the protection of the data ensuring their anonymization
- Precision and reproducibility of the data mining
- Coherence and consistency of the information
- Future use of the data for AI



## Strenghts BARDENA

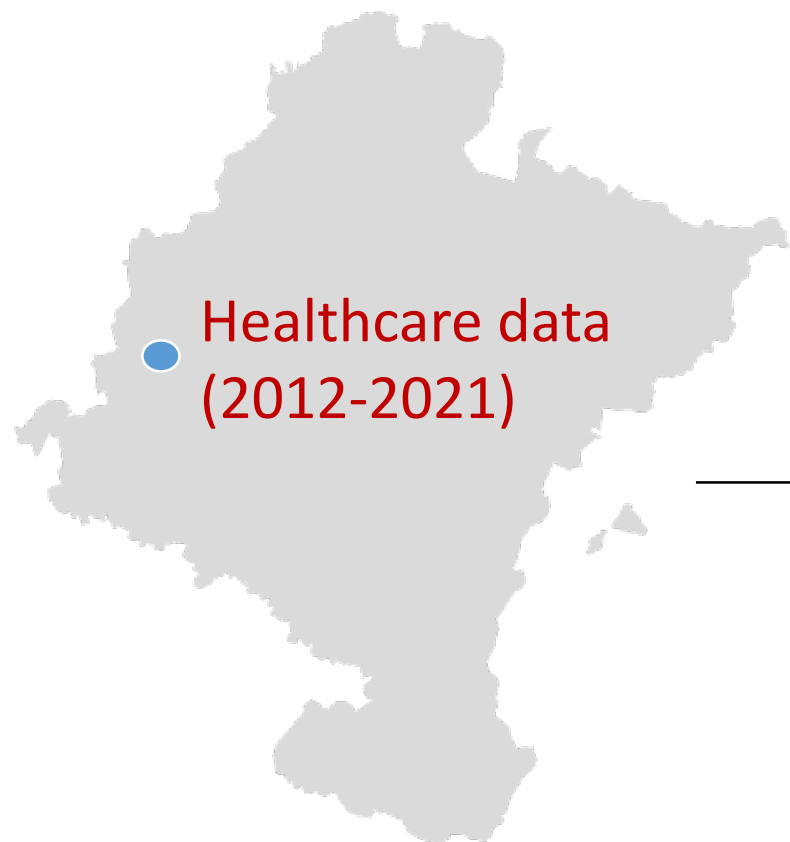
- ✔ Integrate and unify all data
- ✔ Anonymization (GDPR)
- ✔ Keep historical records
- ✔ Quality Control & Audit
- ✔ Performance, speed and power
- ✔ Intuitive model for analysis

# Metadata Management

- Single/Unique definition indicators
- Establish accountability for indicators
- Indicator's management and maintenance scheme



Already incorporated in the DB



Healthcare data  
(2012-2021)

Primary Care

Hospital Mgment CMBD

Day Hospital

Chronic Care

Emergency

Surgery

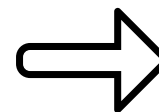
Mental Health

Pharma Management

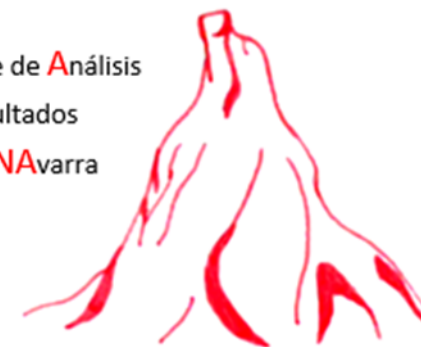
Coded diagnosis

Laboral Inhability Lakora-TIS

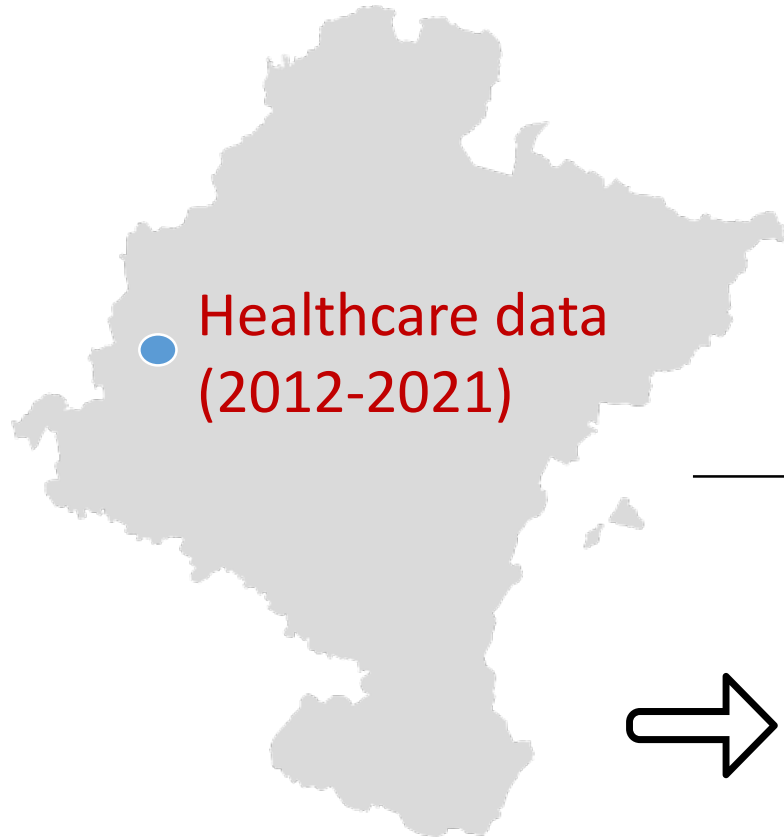
Rehab Treatment



Base de Análisis  
Resultados  
DE NAvarra



On going.....



Clinical Lab data

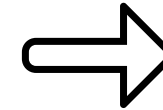
Pathology

Hospital Nursery

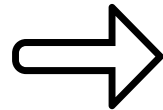
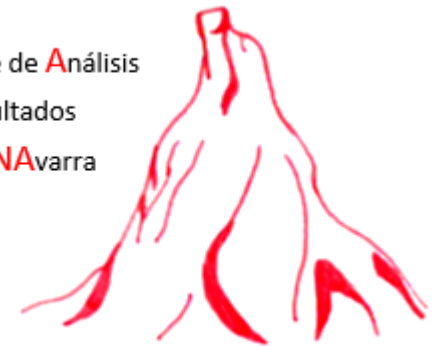
Radiotherapy

Physiotherapy

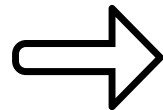
Blood Bank



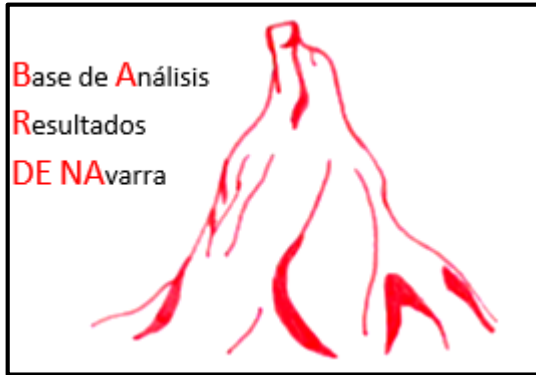
Base de Análisis  
Resultados  
DE NAvarra



**Natural Language Processing**



**COVID related data:  
incidence, clinical  
records, vaccinaton...**



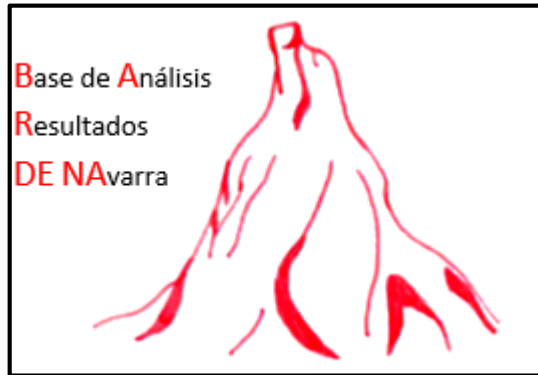
Nafarroako  
Gobernua

Gobierno de Navarra  
Nafarroako Gobernua  
Gobernua de Navarra

## Some features of the structured DB

1. Descriptive analysis of the information to evaluate actions and detection of problems: waiting lists, emergency circuits, drug alerts,...
2. Predictive analysis of trends
3. Generation of data and process mining processes
4. Indicators for:
  - micro management: Direct Clinical professionals (primary care & Hospitals)
  - meso management: Implementation of Strategic Plans
  - macro and strategic management: Definition of the Strategic Actions and Plans
5. Information sources for the different analysts:
  - Simple and easy to handle extracted data for immediate use
  - Snowflake model is also available with the relationships between the different fact and dimension tables that provide advanced analysts with great evaluation power





BARDENA, today is a reality for...

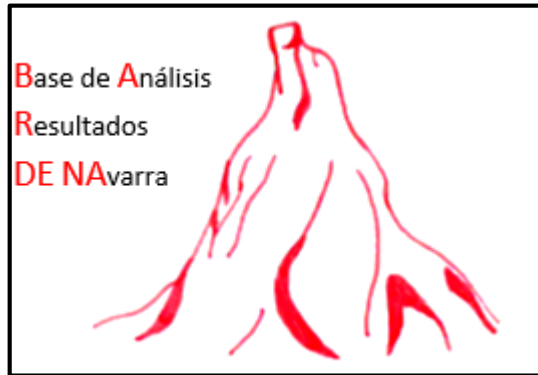
## Analysis and Research of all healthcare information



**Freedom to operate**



**Coherent information**



BARDENA, today is a reality for...

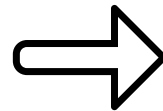
## Management by processes. Use cases: Clinical processes



Analyst



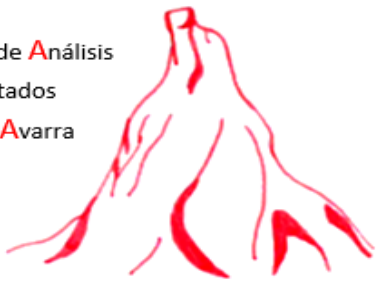
**Improvement sector identification**



**Population segmentation**



**Health programs validation**



# Helping clinical processes: Diabetes



## PANEL DE CONTROL DIABETES AE

Especialista: M3102870

Fecha de cálculo: 22 de noviembre de 2019

Ordenar por

Tipo Diabetes

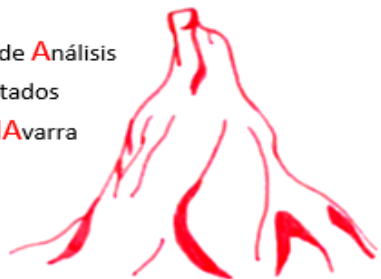
Complejidad

☒ Ascendente  
☐ Descendente

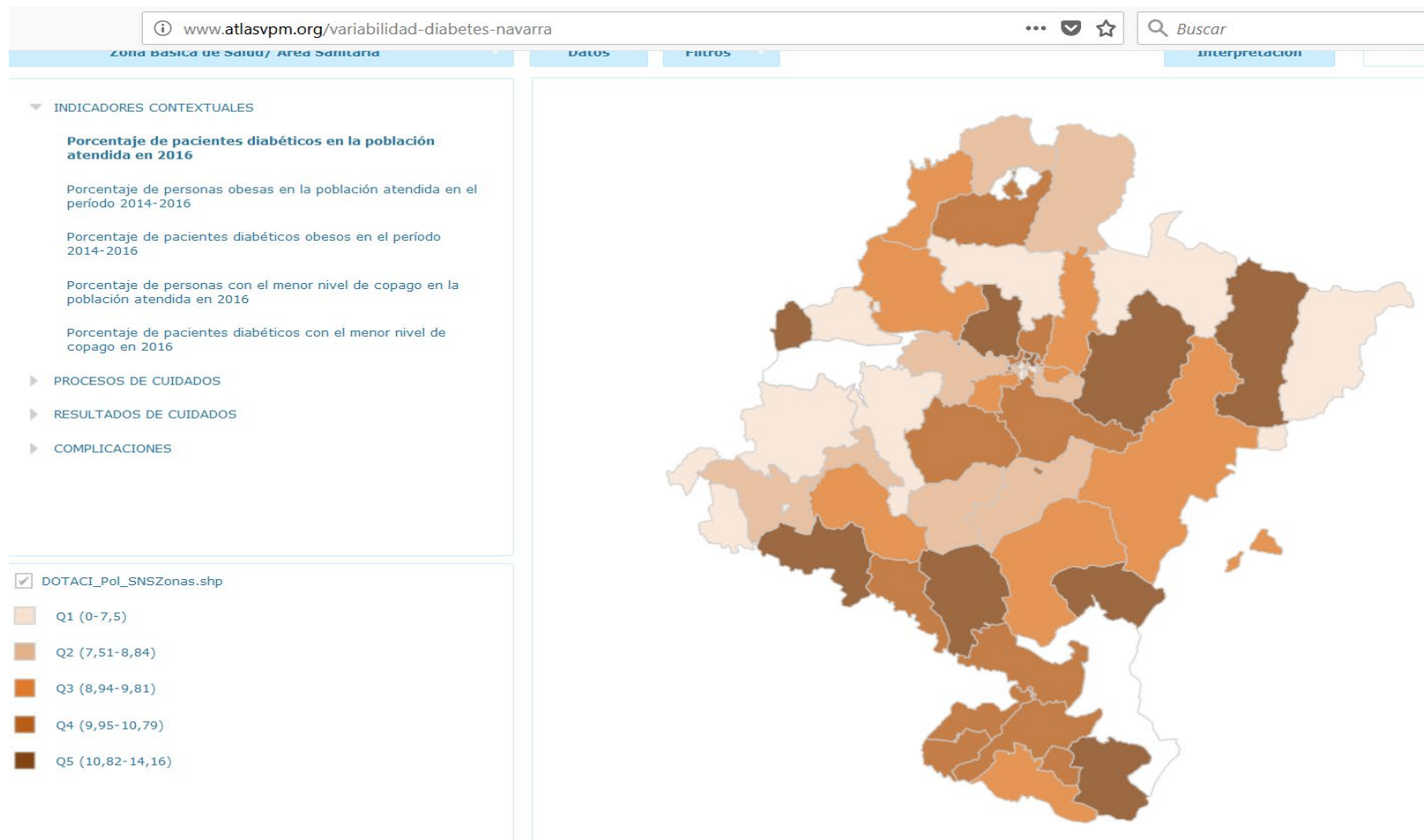
CLASIFICACIÓN	PROCESO	COMPLICACIONES	SEGUIMIENTO
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Nombre Completo Paciente	Sexo	Edad	Tipo Diabetes	Complejidad Diabetes	Hemoglobina Glicada	LDL-Col	Filtrado Glomerular	Cociente Albumina Creatinina	Tension Arterial	Registro Habito Tabaquico	Categoria Riesgo Pie Diabetico	Clasificacion Retinopatia	Hipoglucemias Frecuencia	Asume Autocuidados	Nº Ingresos 12 meses	Nº Urgencias Especializad..
^lan; -1 -1	Femenino	63	DM2(E11)	Desconocida	5,9	99	83	23	140/70	FUM		1		N		
-1 _balm -1	Masculino	84	DM2(E11)	Desconocida	6,1	88	60	14	129/65	ExF>1A				S		
-1 -1 -1	Masculino	41	DM1(E10)	Desconocida	9	126	60		127/97	FUM				N		
-1 -1 -1	Masculino	47	DM2(E11)	Desconocida	7	78	90	4	115/80	ExF>1A				S		
-1 -1 -1	Masculino	61	DM2(E11)	Moderada	7,2	114	90	27	128/78	ExF>1A	4			N		
-1 -1 -1	Femenino	75	DM2(E11)	Desconocida	6,8	116	79	10	140/70	NF	1	1		S		1
-1 -1 -1	Femenino	72	DM2(E11)	Desconocida	10,3	79	89	4	130/70	NF				S		
-1 -1 -1	Masculino	57	DM1(E10)	Desconocida	6,9	113	90	21	179/80	NF	1			N		
-1 -1 -1	Femenino	77	DM2(E11)	Desconocida	8,4	59	66	8	140/80	NF: Nunc..				N		
-1 -1 -1	Masculino	71	DM2(E11)	Desconocida	6,9	81	78	7	162/88	ExF>1A				N		
-1 -1 -1	Femenino	84	DM2(E11)	Desconocida	6,7	95	65	24	152/73	NF				S		
-1 -1 -1	Femenino	87	DM2(E11)	Desconocida	9	90	72	14	145/82	NF	1			S		2

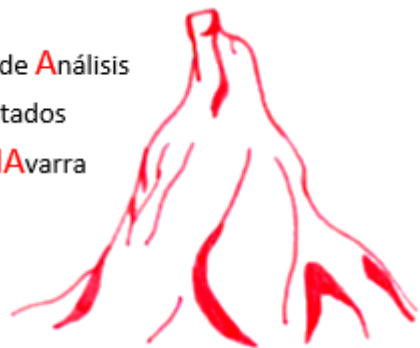
Nombre Completo Paciente	Fecha Hemoglobina Glicada	Fecha Filtrado Glomerular	Fecha Albumina Creatinina	Fecha Clasificacion Retinopatia	Fecha Categoria Riesgo Pie Diabetico
^lan; -1 -1	2019-04-02	2019-04-02	2017-06-15	2019-04-08	
-1 _balm -1	2019-10-08	2019-10-08	2019-10-08		
	2018-11-27	2018-11-27	2018-11-27		
	2016-01-26	2016-01-26			
	2018-07-23	2019-02-01	2018-07-23		
	2018-03-27	2019-09-06	2018-03-27		2019-10-24



# Crossing with geographical data



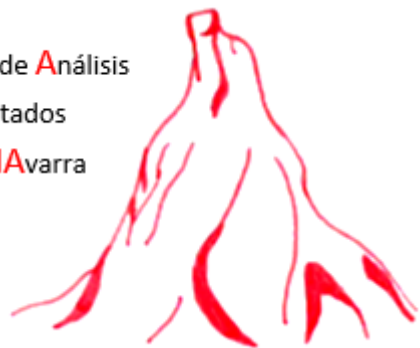
<http://www.atlasvpm.org/variabilidad-diabetes-navarra>



## But also with other information sources I

Social Welfare Study of people **receiving help (€) from Social Services**  
vs **Prevalence of Type 2 Diabetes**

%Diabeticos /población	RIS	RIS	RIS	TotalPoblac No RIS		
	H	M	Total	H	M	Total
5--9	0%	0%	0%	0%	0%	0%
10--17	0%	0%	0%	0%	0%	0%
18-24	0%	0%	0%	0%	0%	0%
25-39	3%	3%	3%	1%	1%	1%
40-54	11%	6%	8%	4%	2%	3%
55-65	6%	4%	5%	6%	3%	4%



## But also with other information sources I

### Welfare Study of people receiving help (€) from Social Services vs Prevalence of Obesity

%Obesos /población	RIS	RIS	RIS	TotalPoblacExluidRIS		
	H	M	Total	H	M	Total
<5	1%	0%	0%	0%	0%	0%
5--9	0%	1%	0%	0%	0%	0%
10--17	3%	3%	3%	1%	1%	1%
18-24	3%	5%	4%	1%	1%	1%
25-39	7%	10%	8%	2%	2%	2%
40-54	12%	17%	14%	6%	5%	6%
55-65	18%	23%	21%	13%	9%	11%

# Clustering – Mental Health

- Study carried out by Dr. Mikel Menta (UPNA)
- BARDENA Anonymized Data Extraction
- Dataset creation
- Testing with different algorithms
- Mental health Segmentation by unserviced clustering

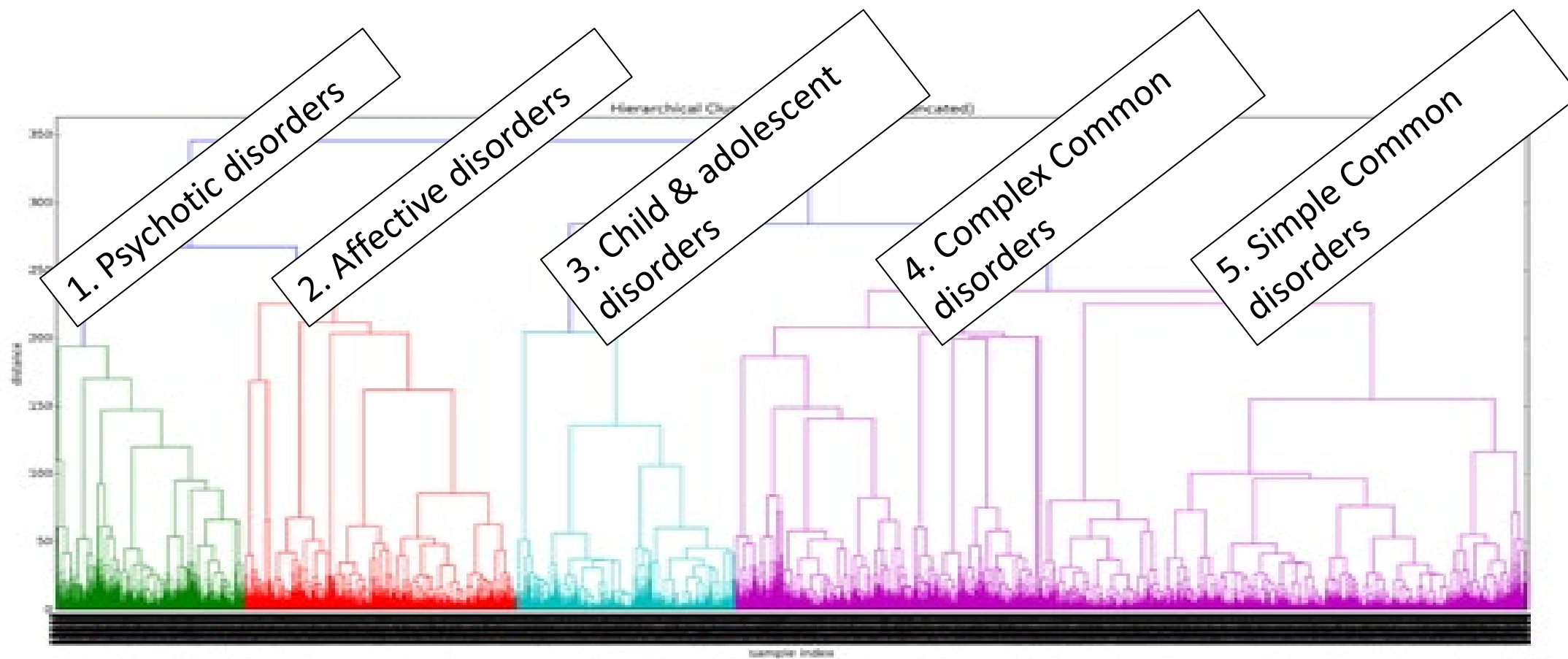


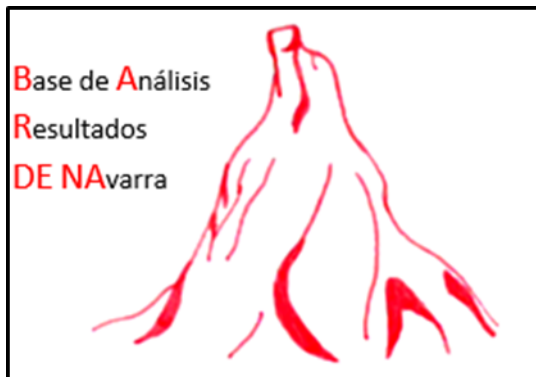
# Clustering – Mental Health – unsupervised

	Centro Clust. 1	std	Centro Clust. 2	std	Centro Clust. 3	std	Centro Clust. 4	std	Centro Clust. 5	std
CONSPSIQUIATRA	5.15	4.07	3.71	2.73	2.96	2.93	3.44	2.85	2.16	2.0
CONSPSICOLOGO	1.02	3.1	1.15	2.96	4.26	6.02	1.92	3.72	1.91	3.13
CONSENFARMERIA	4.43	9.15	0.98	4.31	1.06	2.9	7.74	20.13	0.6	2.33
CONSTRABSOCIAL	1.59	4.36	0.24	1.16	0.21	0.87	0.51	1.64	0.09	0.55
CONSULTASSMFALLIDAS	1.1	2.0	0.6	1.29	0.83	1.58	1.88	3.99	0.51	1.01
CONSULTASNOSM	3.63	5.42	5.96	6.75	2.57	3.97	5.04	6.65	5.95	8.67
NUMESPCONSULTASNOSM	2.64	1.9	3.62	2.32	2.19	1.36	3.08	2.09	3.38	2.36
CONSULTASAP	16.08	15.99	18.69	15.51	10.25	8.44	15.03	14.96	17.3	19.98
NURGENCIAS	0.98	2.8	0.68	1.25	0.57	1.21	0.88	1.64	0.76	1.48
NHOSPIT	0.38	0.93	0.07	0.32	0.01	0.14	0.08	0.34	0.01	0.09
NUMPSICOTROPICOS	3.32	2.36	3.17	2.01	1.0	1.24	2.2	2.15	1.94	1.85
3OMASGRUPOS PSICOT	0.47	0.5	0.35	0.48	0.05	0.23	0.24	0.43	0.13	0.33
FARMG1	0.0	0.02	0.02	0.12	0.0	0.0	0.0	0.0	0.0	0.0
FARMG2	0.16	0.37	0.19	0.39	0.04	0.16	0.22	0.41	0.13	0.34
FARMG3	0.14	0.34	0.0	0.05	0.0	0.04	0.01	0.05	0.0	0.01
FARMG4	0.73	0.45	0.27	0.44	0.1	0.3	0.22	0.41	0.08	0.27
FARMG5	0.1	0.3	0.0	0.03	0.0	0.0	0.0	0.02	0.0	0.0
FARMG6	0.2	0.4	0.19	0.39	0.02	0.14	0.04	0.15	0.0	0.03
FARMG7	0.59	0.49	0.67	0.47	0.12	0.32	0.52	0.5	0.57	0.5
FARMG8	0.44	0.5	0.77	0.42	0.1	0.3	0.47	0.5	0.56	0.5
FARMG9	0.01	0.05	0.0	0.07	0.46	0.5	0.02	0.12	0.0	0.01
FARMG10	0.0	0.0	0.04	0.18	0.0	0.0	0.0	0.0	0.0	0.0
FARMG11	0.01	0.05	0.0	0.03	0.0	0.03	0.08	0.27	0.0	0.03
NUM_NO_PSICATC5	3.81	4.01	5.81	4.81	2.25	2.53	4.04	4.08	4.74	4.54
DIAGG1	0.0	0.03	0.09	0.29	0.0	0.0	0.0	0.0	0.0	0.0
DIAGG2	0.02	0.16	0.0	0.06	0.01	0.11	0.42	0.49	0.0	0.05
DIAGG3	0.81	0.39	0.0	0.06	0.0	0.05	0.02	0.13	0.0	0.02
DIAGG4	0.07	0.25	0.88	0.33	0.03	0.15	0.05	0.21	0.01	0.1
DIAGG5	0.06	0.24	0.02	0.12	0.04	0.15	0.07	0.26	0.73	0.44
DIAGG6	0.01	0.07	0.0	0.03	0.0	0.0	0.09	0.29	0.0	0.01
DIAGG7	0.02	0.13	0.01	0.09	0.0	0.04	0.25	0.43	0.0	0.02
DIAGG8	0.0	0.03	0.0	0.0	0.0	0.0	0.08	0.27	0.0	0.02
DIAGG9	0.0	0.06	0.0	0.0	0.15	0.36	0.0	0.0	0.0	0.0
DIAGG10	0.0	0.05	0.0	0.02	0.74	0.44	0.0	0.03	0.0	0.02
DIAGG11	0.0	0.0	0.0	0.0	0.0	0.0	0.01	0.05	0.0	0.0
DIAGG12	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.03	0.0	0.0
DIAGG13	0.01	0.07	0.0	0.05	0.02	0.15	0.01	0.05	0.26	0.44
NUMDIAGNOSTICOS	1.2	0.47	1.22	0.47	1.34	0.55	1.56	0.67	1.18	0.41
DIAGNOSTICO_GRAVE	0.89	0.31	0.97	0.16	0.1	0.3	0.11	0.31	0.04	0.19
TBIPOLAR	0.01	0.12	0.21	0.41	0.0	0.07	0.01	0.07	0.0	0.01
TESQUIZOFRENIA	0.45	0.5	0.0	0.03	0.0	0.02	0.01	0.1	0.0	0.0
DEPRECURRENTES	0.02	0.13	0.23	0.42	0.0	0.0	0.0	0.07	0.0	0.02
DIAGAGRAVANTE	0.1	0.31	0.05	0.22	0.03	0.17	0.29	0.45	0.0	0.05
EDAD	47.69	15.41	56.82	17.16	15.02	9.79	41.79	15.07	41.74	19.1
SEXO	0.46	0.5	0.66	0.47	0.32	0.46	0.43	0.49	0.63	0.48
NACIDO_EN_EXTRANJERO	0.09	0.29	0.07	0.26	0.08	0.26	0.12	0.33	0.13	0.34
RIS	0.08	0.27	0.05	0.23	0.09	0.28	0.19	0.39	0.09	0.29
TSI	0.15	0.35	0.28	0.45	0.43	0.49	0.19	0.39	0.3	0.46
GMA	6.63	4.52	8.1	5.36	3.21	2.73	6.35	4.49	5.99	4.99
	N=2587 (12.81%)		N=3740 (18.52%)		N=3000 (14.86%)		N=4176 (20.68%)		N=6692 (33.14%)	



# Clustering – Mental Health – unsupervised





BARDENA, also a tool for **analytical accounting**



Analyst

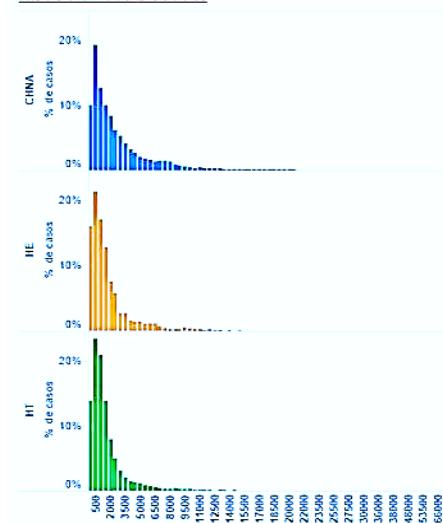
Define costs at patient's level

At clinical episode' level

#### RESUMEN DE COSTE

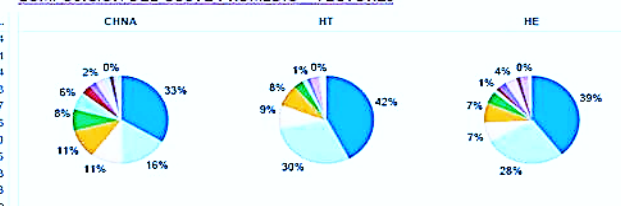
	CHNA	HT	HE	Total gene..
Número de casos	47.976	9.516	5.912	63.404
Total (€)	172.718.143	18.899.915	13.263.973	204.882.031
Media	3.600.1	1.988.1	2.243.6	3.231.4
Desviación estandar	6.529	2.776	2.990	5.688
Límite superior de interv...	3.659	2.042	2.320	3.277
Límite inferior de interv...	3.542	1.930	2.167	3.166
Mínimo	0	13	4	0
Primer cuartil	900	809	676	865
Mediana	1.920	1.274	1.356	1.703
Tercer cuartil	3.976	2.156	2.507	3.533
Máximo	229.429	127.450	47.226	229.429
Peso	1.5862	1.3341	1.2922	1.5209

#### HISTOGRAMA DE COSTES



#### ANALISIS COSTE PACIENTE 2014 - ALTAS

##### COMPOSICION DEL COSTE PROMEDIO - VECTORES

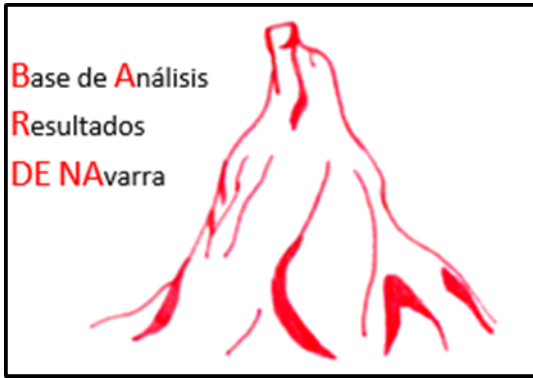


Act: Vector Cod

HOSP\_ENF QUIROPROG HOSP\_MED UCI PROTESIS

##### GRD NUMERO CASOS

Cl.	Clas Grd Desc	% de total	Número de reg..	Número de casos
373	PARTO VAGINAL SIN COMPLICACIONES	4.82%	3.058	3.058
243	PROBLEMAS MEDICOS DE LA ESPALDA	3.41%	2.159	2.159
039	PROCEDIMIENTOS SOBRE CRISTALINO CON O.S.N.	2.69%	1.703	1.703
372	PARTO VAGINAL CON COMPLICACIONES	2.30%	1.456	1.456
541	NEUMONIA SIMPLE Y OTROS TRAST. RESPIRATOR.	2.00%	1.270	1.270
222	PROCEDIMIENTOS SOBRE LA RODILLA SIN CC	1.64%	1.039	1.039
127	INSUFICIENCIA CARDIACA & SHOCK	1.38%	876	876
494	COLELITECTOMIA LAPAROSCOPICA SIN EXPLD.	1.31%	832	832
818	SUSTITUCION DE CADERA EXCEPTO POR COMPLI.	1.16%	738	738
229	PROC. SOBRE MANO O MUÑECA. EXCEPTO PROC.	1.15%	726	726
359	PROC. SOBRE UTERO & ANEXOS POR CA IN SITU.	1.12%	709	709
209	SUSTITUCION ARTICULACION MAYOR EXCEPTO C.	1.10%	698	698
430	PSICOSIS	0.96%	610	610
055	PROCEDIMIENTOS MISCELANEOS SOBRE OIDO. N.	0.94%	599	599
014	ICTUS CON INFARTO	0.94%	594	594
311	PROCEDIMIENTOS TRANSURETRALES SIN CC	0.91%	580	580
867	ESDISION LOCAL Y EXTRACCION DE DISPOSITIV.	0.89%	566	566
544	ICC & ARRITMIA CARDIACA CON CC MAYOR	0.88%	555	555
006	LIBERACION DE TUNEL CARRIANO	0.79%	499	499
225	PROCEDIMIENTOS SOBRE EL PIE	0.79%	495	495



BARDENA, is today a reality for...

## Distribution of clinical and management information



Manager

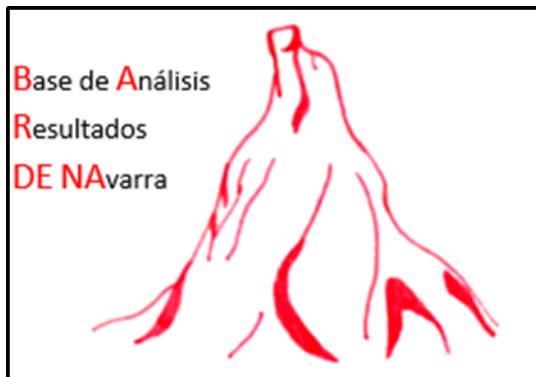
Clinic prof



**Reports (Dashboards) ad-hoc**



**Indicators with a Single Trustable Source (Metadata)**



BARDENA, from now on...

To improve in ...

- Data mining (processes)
- Information distribution (that each manager and each clinician receives what they really need in their day-to-day life)

To do...

- Predictive models (with the support of Artificial Intelligence)

# BARDENA Project mayor assets

## Leadership & Manegment

Mission & Vision

Proper situation analysis

Realistic aims

## Improved use of resources

Multidisciplinary team

Robust work pipeline





BARDENA

¡GRACIAS!

Juan Cruz Cigudosa

Navarra Government Minister for the area of University,  
Innovation and Digital Transformation