

# Identificación de estrellas Be

*Reddening-free \$Q\\$ indices to identify Be star candidates*



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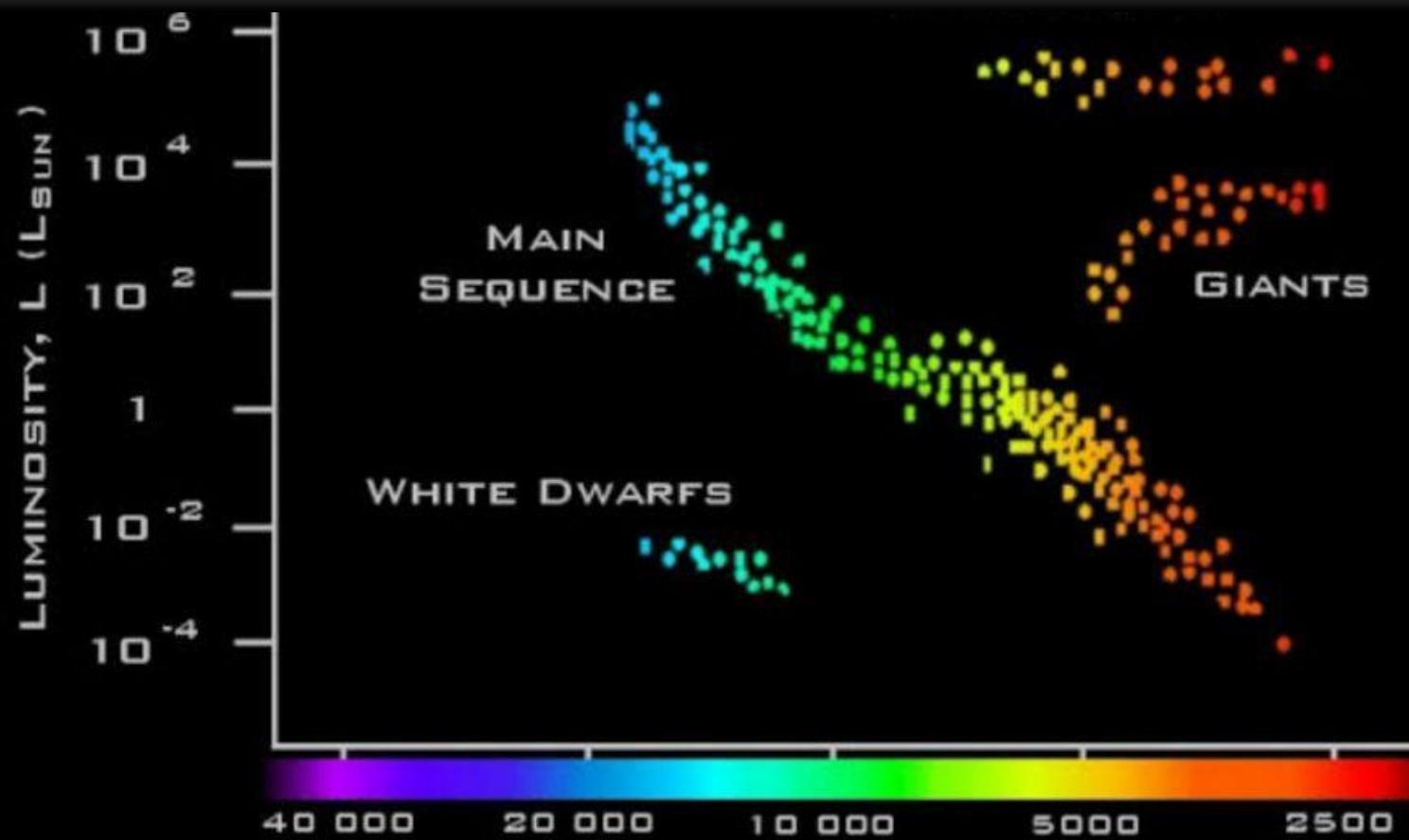
Facundo Quiroga



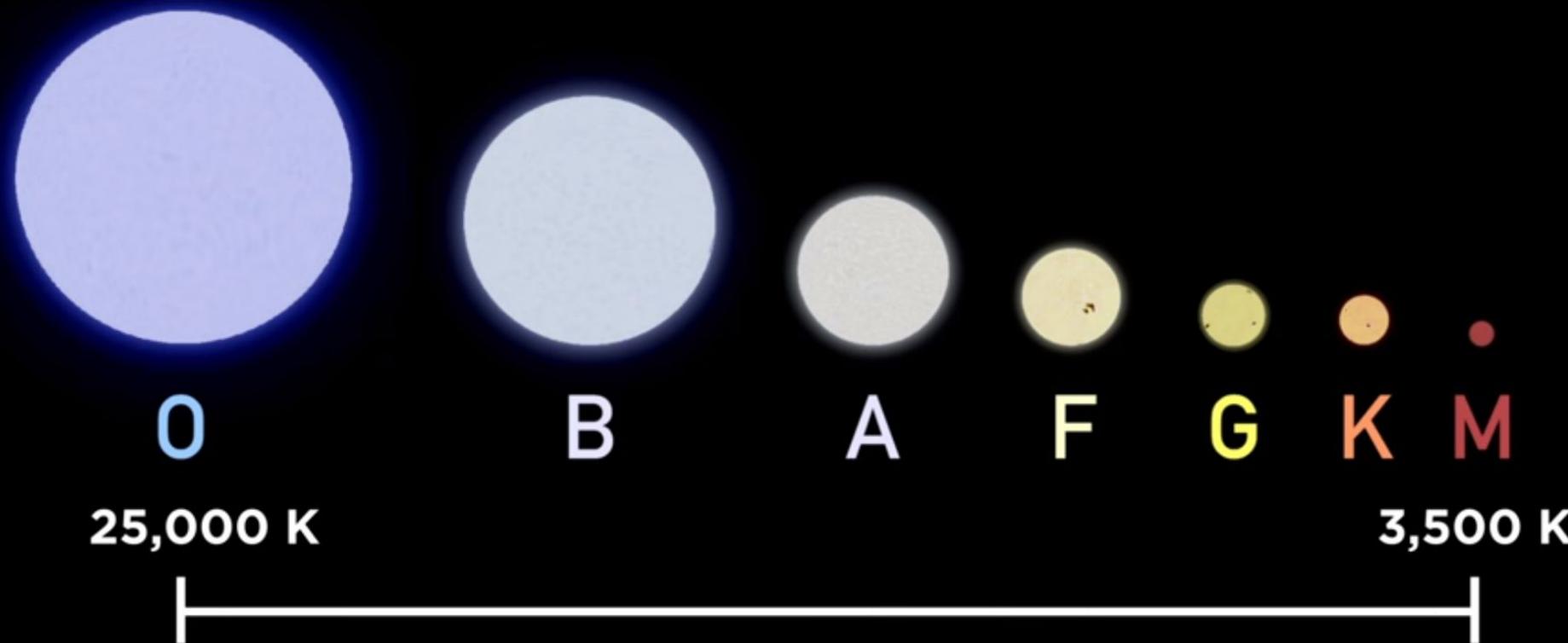
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y Geofísicas  
UNIVERSIDAD NACIONAL DE LA PLATA



# Clasificación de Estrellas - Diagrama HR



# Clasificación Estelar - Masa, color y temperatura



# Clasificación Estelar - Espectrometría

O  
B  
A  
F  
G  
K  
M

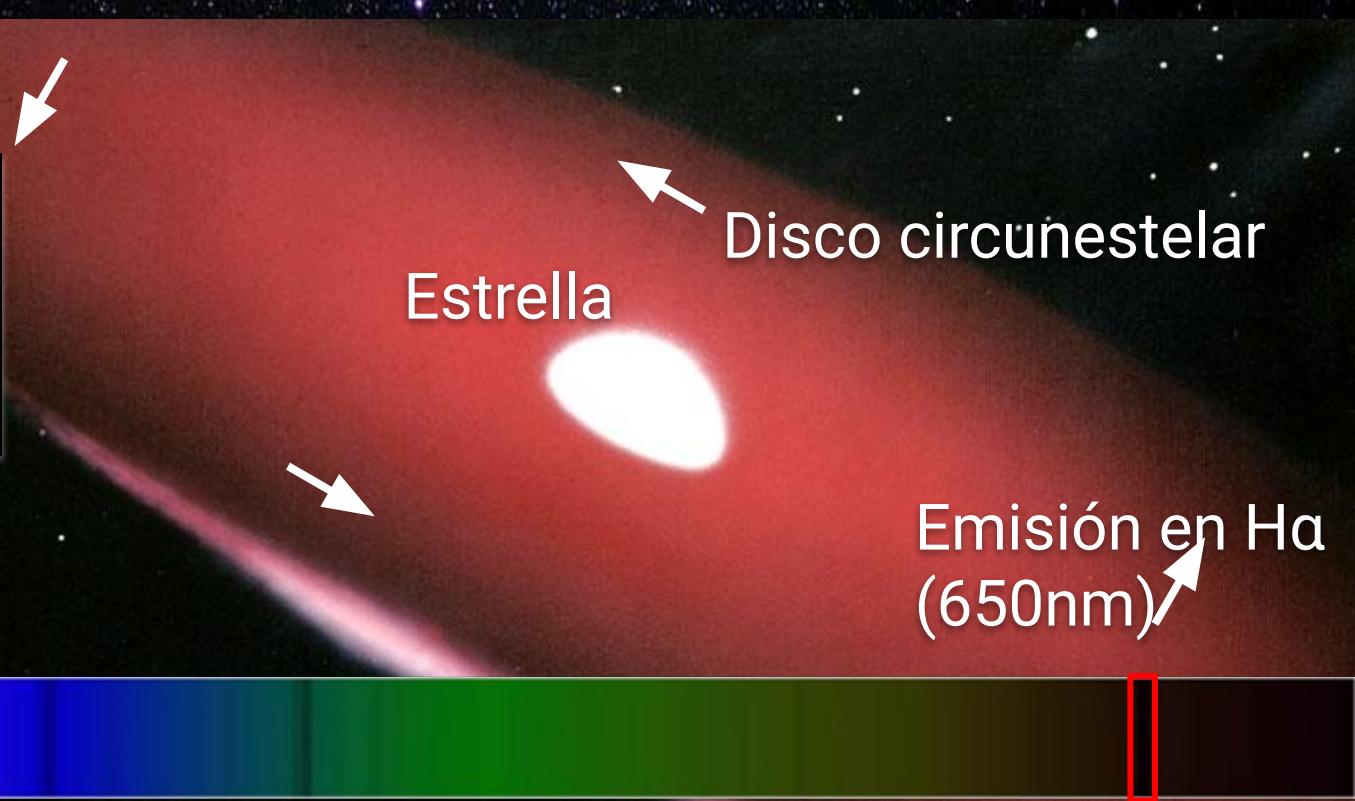
Estándar de oro - Análisis manual

# Clasificación Estelar - Estrellas Be



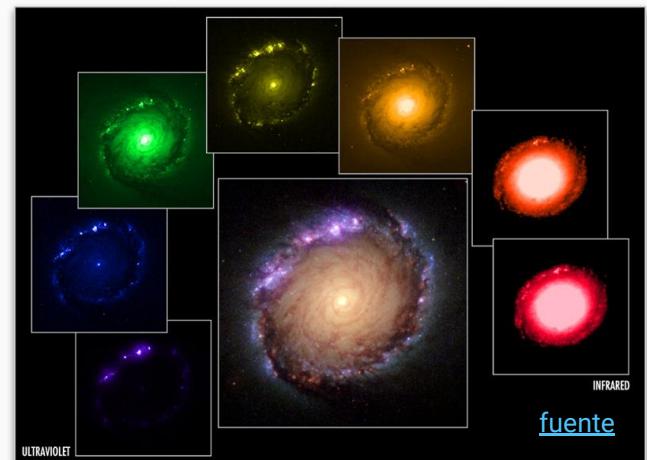
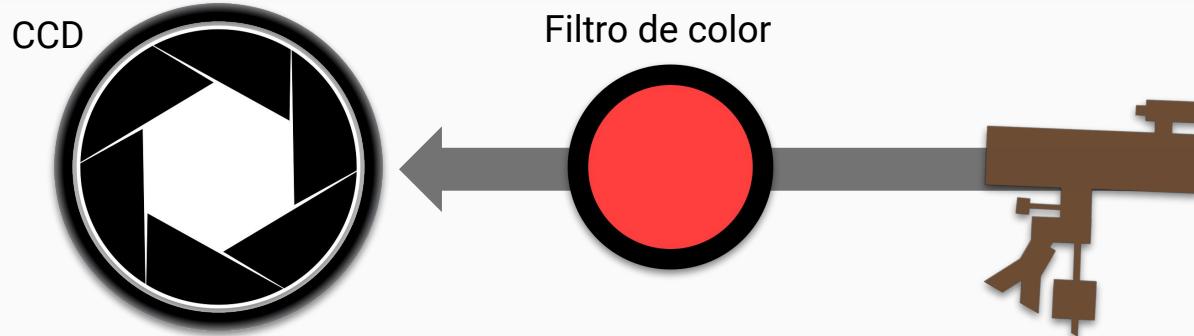
No supergigante  
Tipo espectral B

B



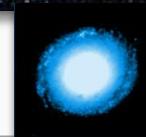
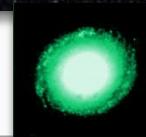
**Objetivo: Identificar nuevas estrellas BE**

# Obtención de datos: Fotometría Estelar

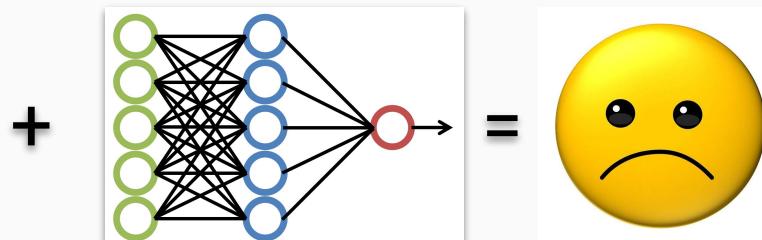


Datos de **baja** calidad, **fáciles** de obtener

# Clasificación de Be con Fotometría y ML



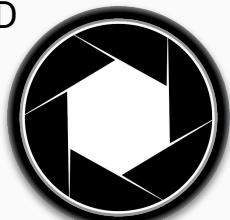
ID	Intensidad promedio en filtro 1	Intensidad promedio en filtro ...	Intensidad promedio en filtro N	Clase
1	1.3	...	2.5	Be
2	0.5	...	2.1	Otra
...	...	...	...	...



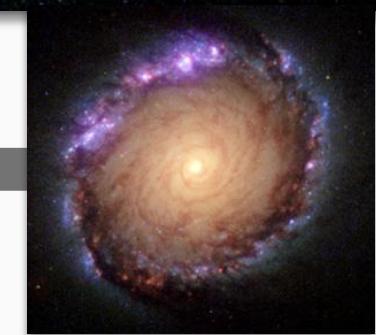
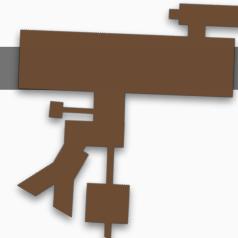
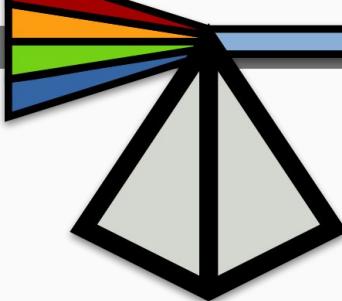
Difícil determinar  
clase con Fotometría

# Obtención de datos: Espectrometría Estelar

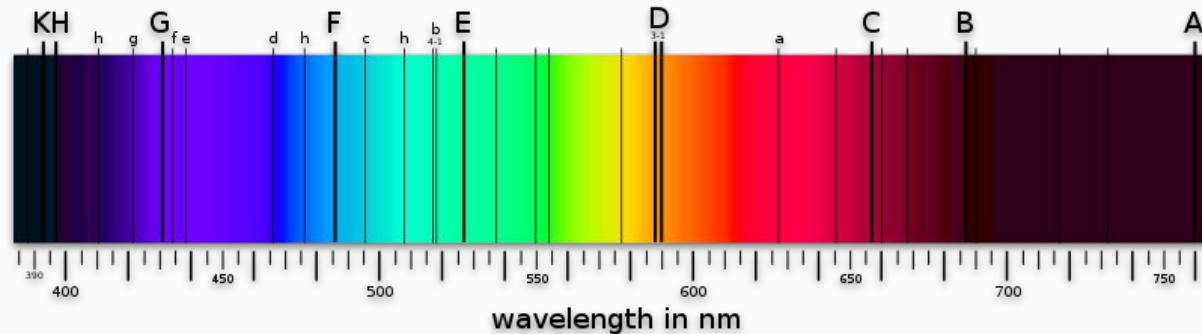
CCD



Prisma



Espectro



Datos de **alta** calidad, **costosos** de obtener

# Clasificación de Be con Espectrometría y ML

ID	Intensidad en longitud de onda 1	Intensidad en longitud de onda ...	Intensidad en longitud de onda N	Clase
1	1.3	...	2.5	Be
2	0.5	...	2.1	Otra
...	...	...	...	...



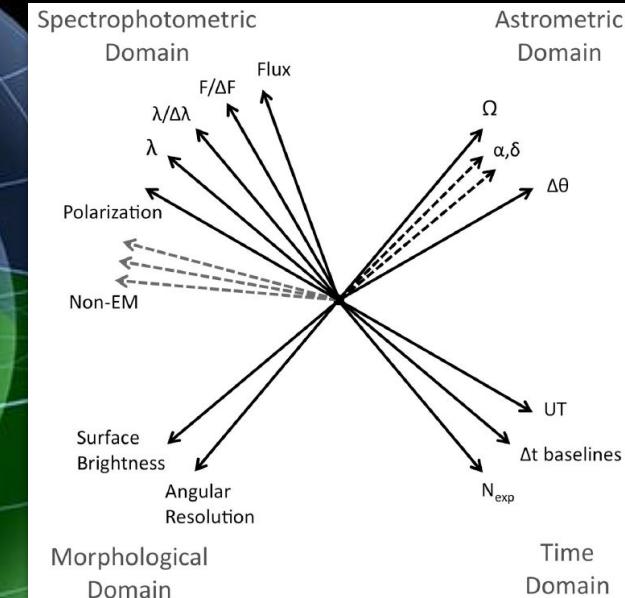
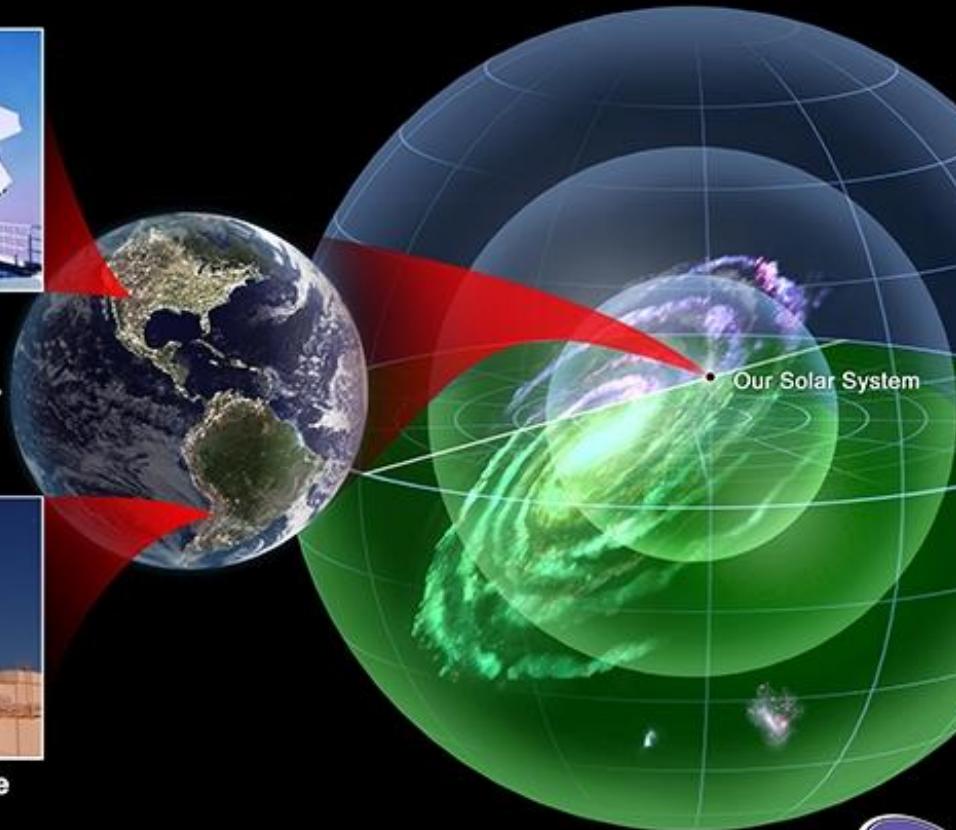
# Fuentes de datos -> Surveys del cielo



Sloan Foundation  
Telescope  
New Mexico, U.S.A.



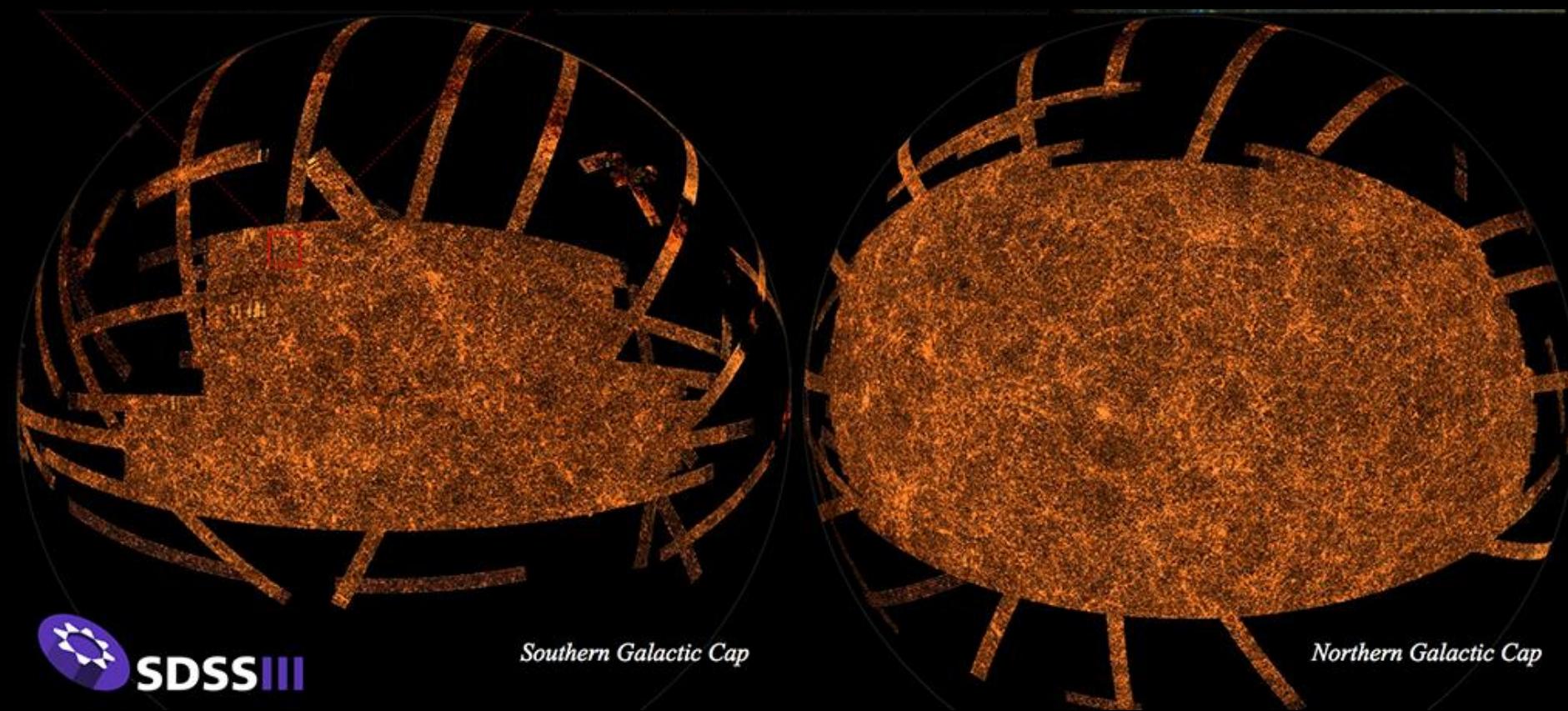
du Pont Telescope  
Chile



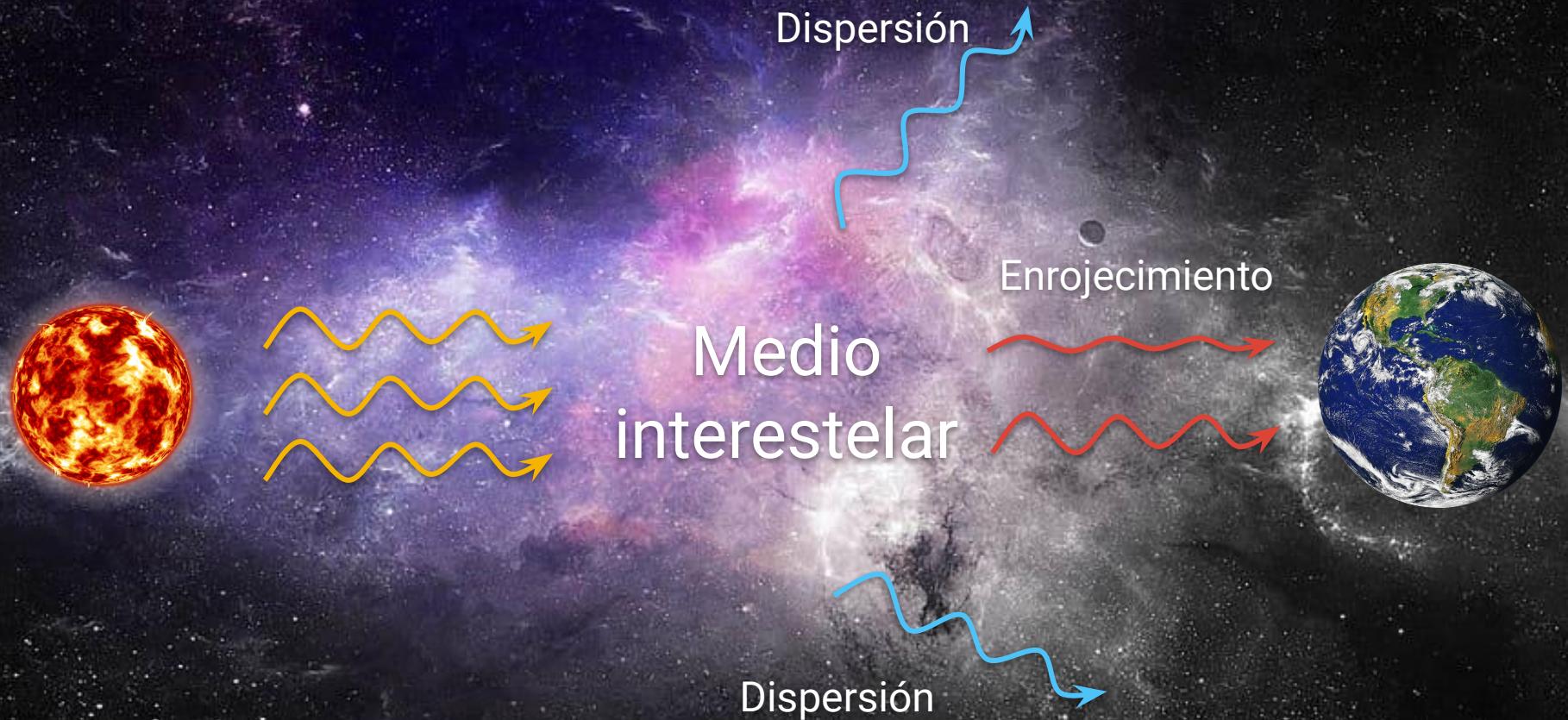
# Surveys del cielo - Alta variabilidad

Survey	Type	Duration	Bandpasses	Lim. flux	Area coverage	N <sub>sources</sub>	Notes
DSS scans	Visible	1950's-1990's	B (~ 450 nm) R (~ 650 nm) I (~ 800 nm)	21 – 22 mag 20 – 21 mag 19 – 20 mag	Full sky	$\sim 10^9$	Scans of plates from the POSS and ESO/SERC surveys
SDSS-I SDSS-II SDSS-III	Visible	2000-2005 2005-2008 2009-2014	u (~ 800 nm) g (~ 800 nm) r (~ 800 nm) i (~ 800 nm) z (~ 800 nm)	22.0 mag 22.2 mag 22.2 mag 21.3 mag 20.5 mag	14,500 deg <sup>2</sup>	$4.7 \times 10^8$	Numbers quoted for DR8 (2011). In addition, spectra of ~ 1.6 million objects
2MASS	Near IR	1997-2001	J (~ 1.25 μm) H (~ 1.65 μm) K <sub>s</sub> (~ 2.15 μm)	15.8 mag 15.1 mag 14.3 mag	Full sky	$4.7 \times 10^8$	
UKIDSS	Near IR	2005-2012	Y (~ 1.05 μm) J (~ 1.25 μm) H (~ 1.65 μm) K (~ 2.2 μm)	20.5 mag 20.0 mag 18.8 mag 18.4 mag	7,500 deg <sup>2</sup>	$\sim 10^9$	Estim. final numbers quoted for the LAS; deeper surveys over smaller areas also done
IRAS	Mid/Far IR (space)	1983-1986	12 μm 25 μm 60 μm 100 μm	0.5 Jy 0.5 Jy 0.5 Jy 1.5 Jy	Full sky	$1.7 \times 10^5$	
NVSS	Radio	1993-1996	1.4 GHz	2.5 mJy	32,800 deg <sup>2</sup>	$1.8 \times 10^6$	Beam ~ 45 arcsec

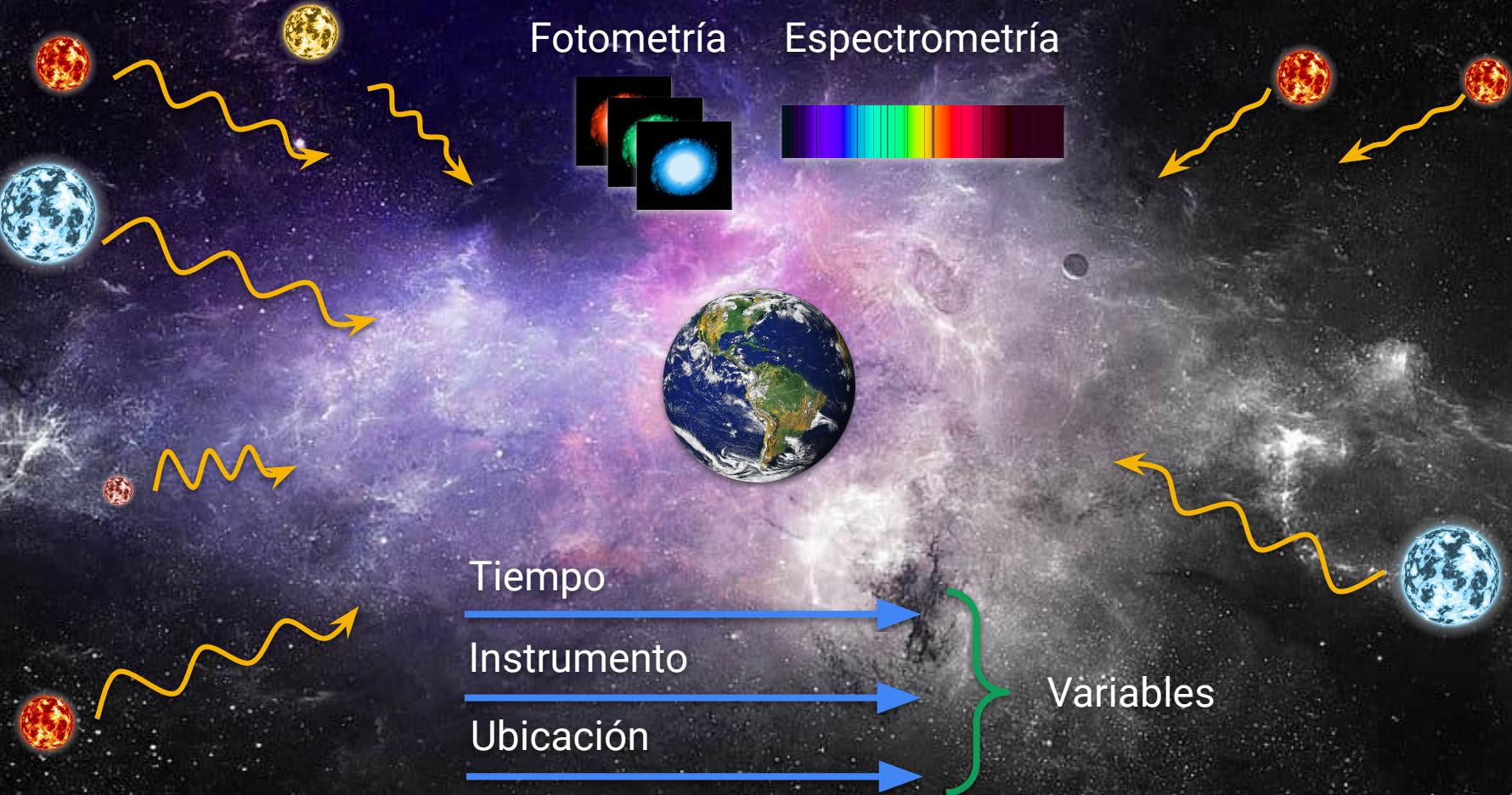
# Surveys del cielo - Cobertura



# Extinción estelar (enrojecimiento)

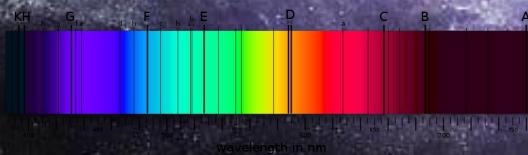


# Resumen de Desafíos

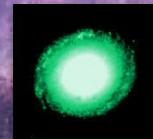


# Nuestro enfoque - Datos fotométricos etiquetados

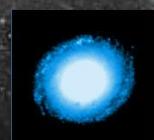
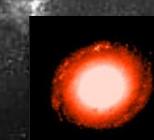
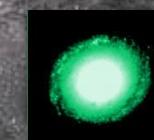
Etiquetado



Sin Etiquetar



Etiquetado



Se reducen significativamente las fuentes de datos

# Nuestro enfoque - Bases de datos

Dataset	Normal OB	EM	Total
Mohr-Smith et al. (2017 [20])	5629	248	5877
Liu et al. (2019 [17])	185	98	283

Mohr-Smith et al.

Uso  
Entrenamiento y  
Prueba

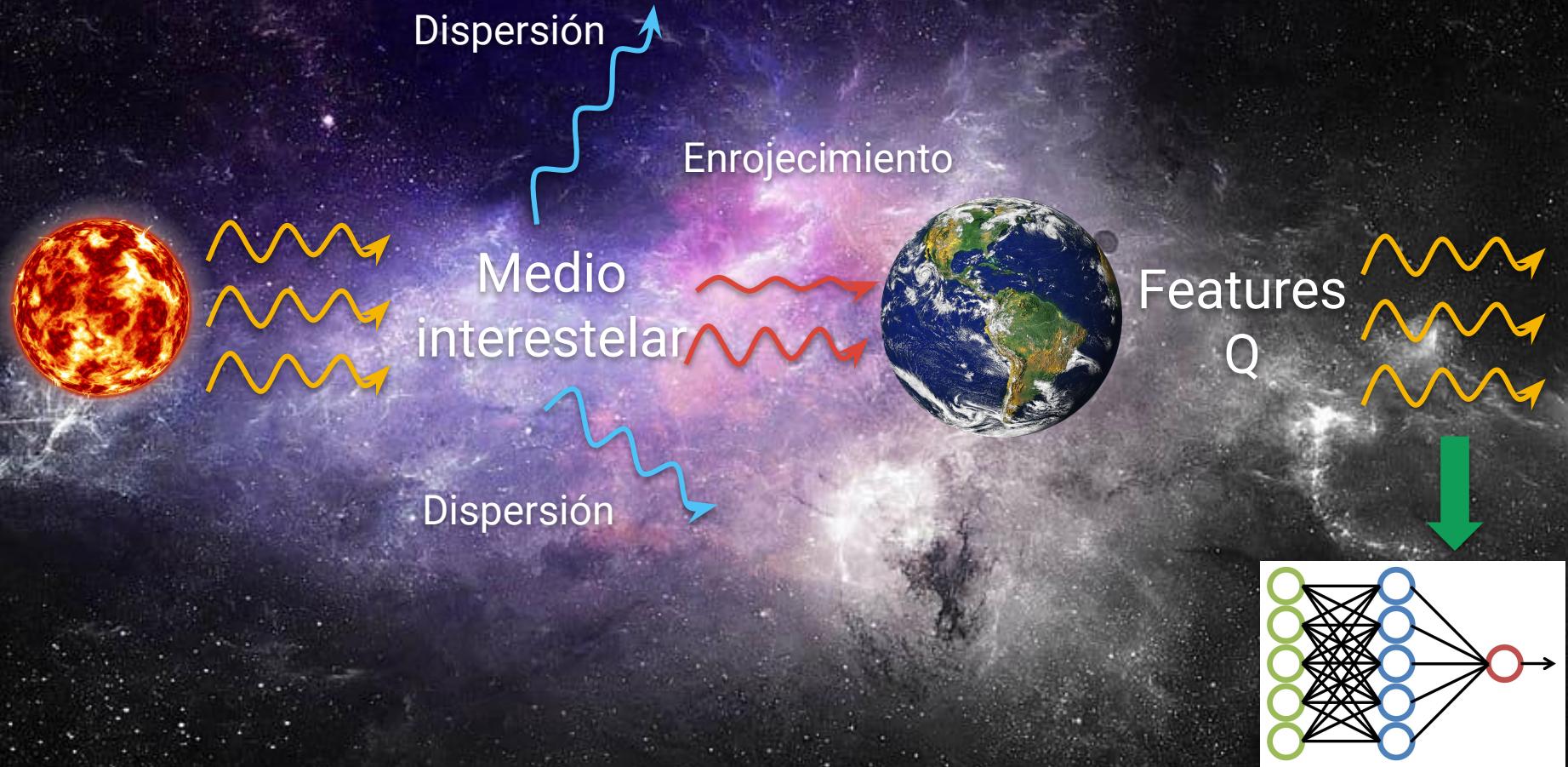
Surveys  
VPHAS+  
2MASS

Liu et al.

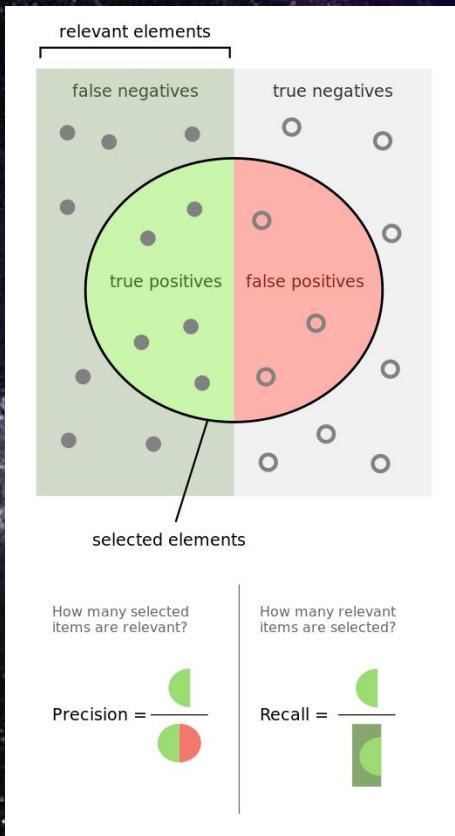
Uso  
Prueba  
Surveys  
VPHAS+  
IPHAS

Evaluar las generalización a otras áreas y surveys

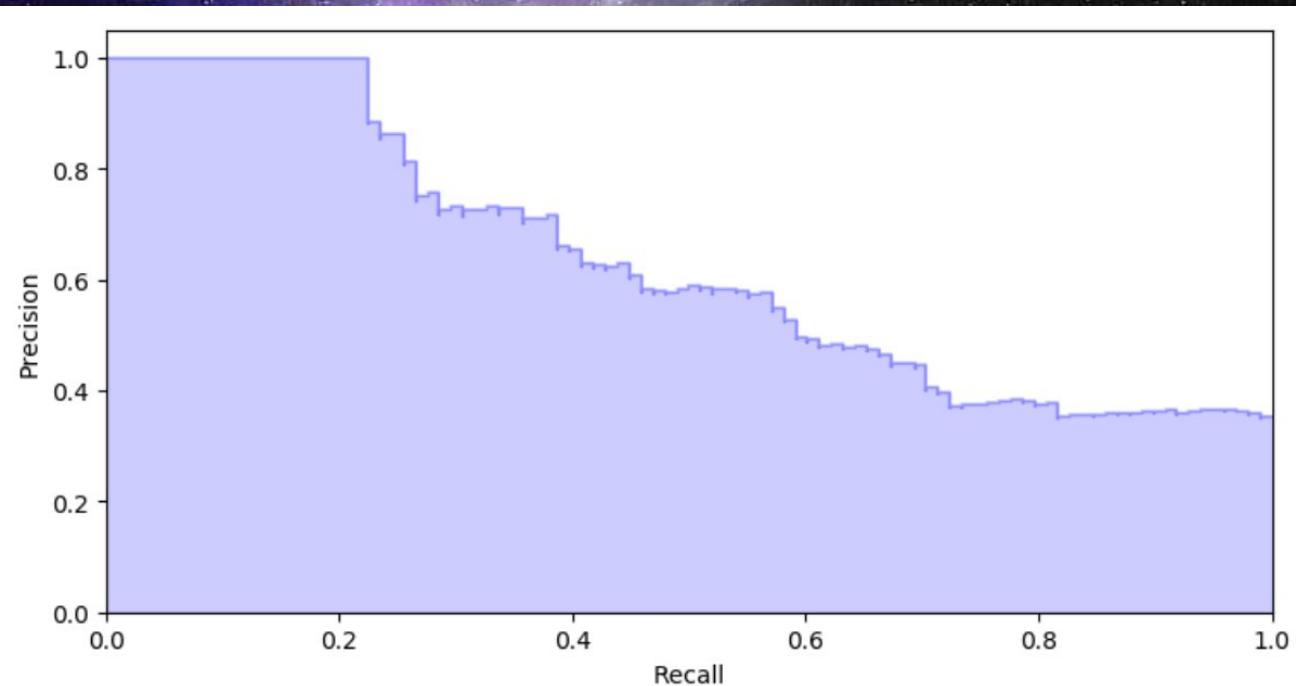
# Features Q + Redes Neuronales



# Metodología de evaluación - Precision y Recall



Modelo probabilístico:  $P(\text{Estrella Be}) > \text{umbral}$   
Variando umbral -> Curva de Precision - Recall



# Resultados: Recall al 99% de Precision

Model	Features	Mohr-Smith (Recall)	Liu (Recall)
Log. Regression	Magnitudes	84.2 ( $\pm 7$ )%	5.7 ( $\pm 0.1$ )%
Log. Regression	$Q$	81.3 ( $\pm 12$ )%	5.5 ( $\pm 10$ )%
Log. Regression	NCA	74.6( $\pm 11$ )%	13.9 ( $\pm 9$ )%
SVM (Linear)	Magnitudes	82.4( $\pm 14$ )%	0( $\pm 0$ )%
SVM (Linear)	$Q$	85.2( $\pm 9$ )%	9.2 ( $\pm 11$ )%
SVM (Gaussian)	Magnitudes	85.2( $\pm 11$ )%	13.1 ( $\pm 2$ )%
SVM (Gaussian)	$Q$	37.2( $\pm 3$ )%	4.7 ( $\pm 3$ )%
Neural Network	Magnitudes	84.8( $\pm 8$ )%	9.5( $\pm 4$ )%
Neural Network	$Q$	85.2( $\pm 14$ )%	<b>25</b> ( $\pm 8$ )%

Conclusión: Features Q aumentan la generalización

