

# Penalized Bayesian Methods for Product Ranking Using Both Positive and Negative References

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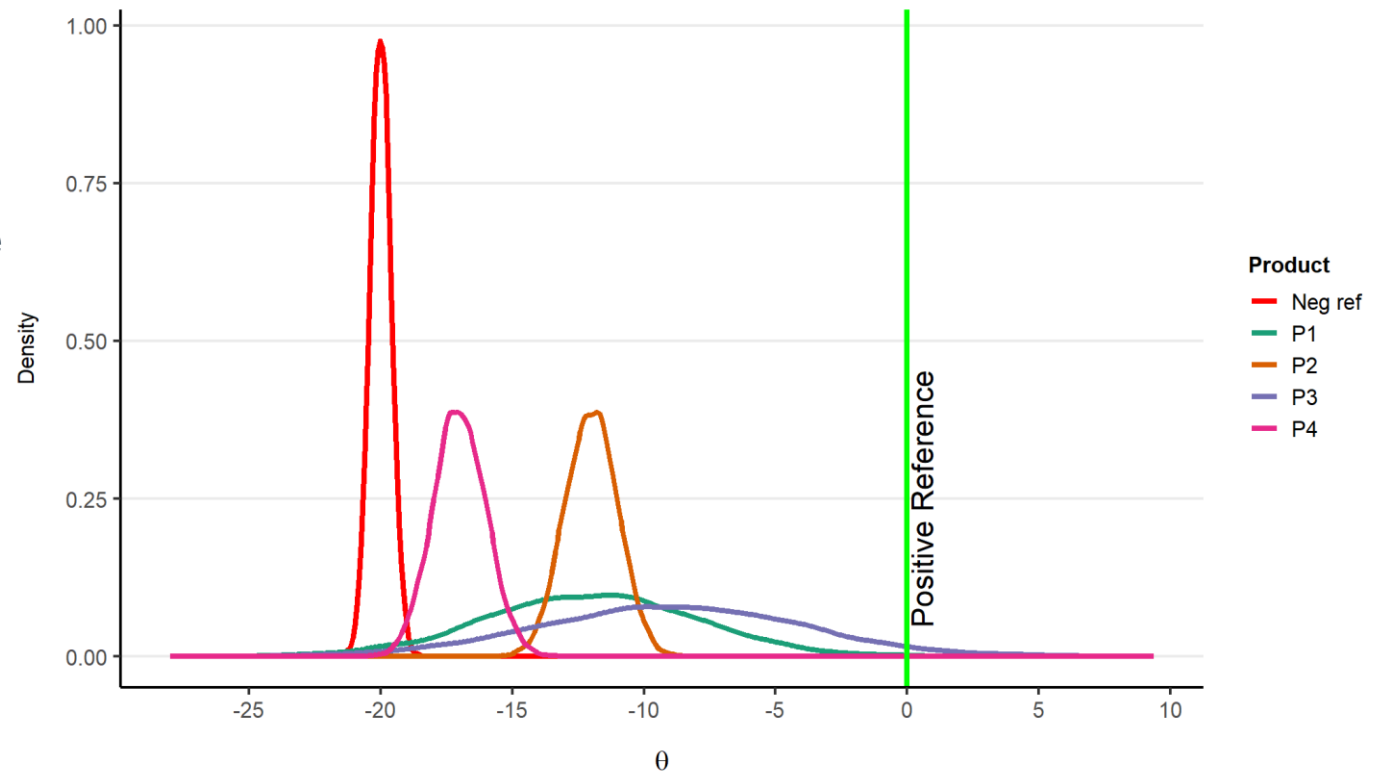
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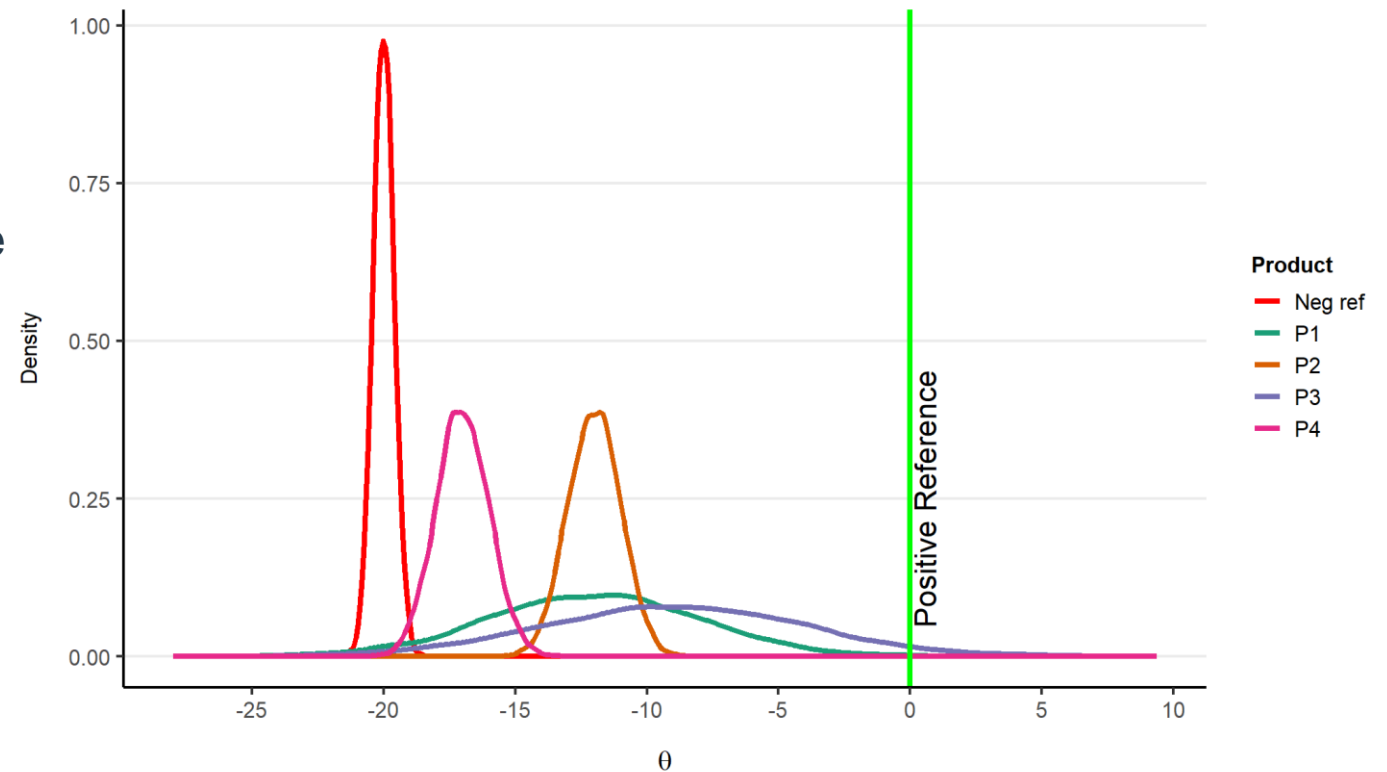
# Context and data

- Overall comparison of posterior mean efficacy distributions of 4 products with regards to
  - One positive reference: maximum possible efficacy (not achievable in practice)
  - One negative reference: fifth product known to have the worst efficacy
- Each comparison summarized by one unique metric (then used to rank products)



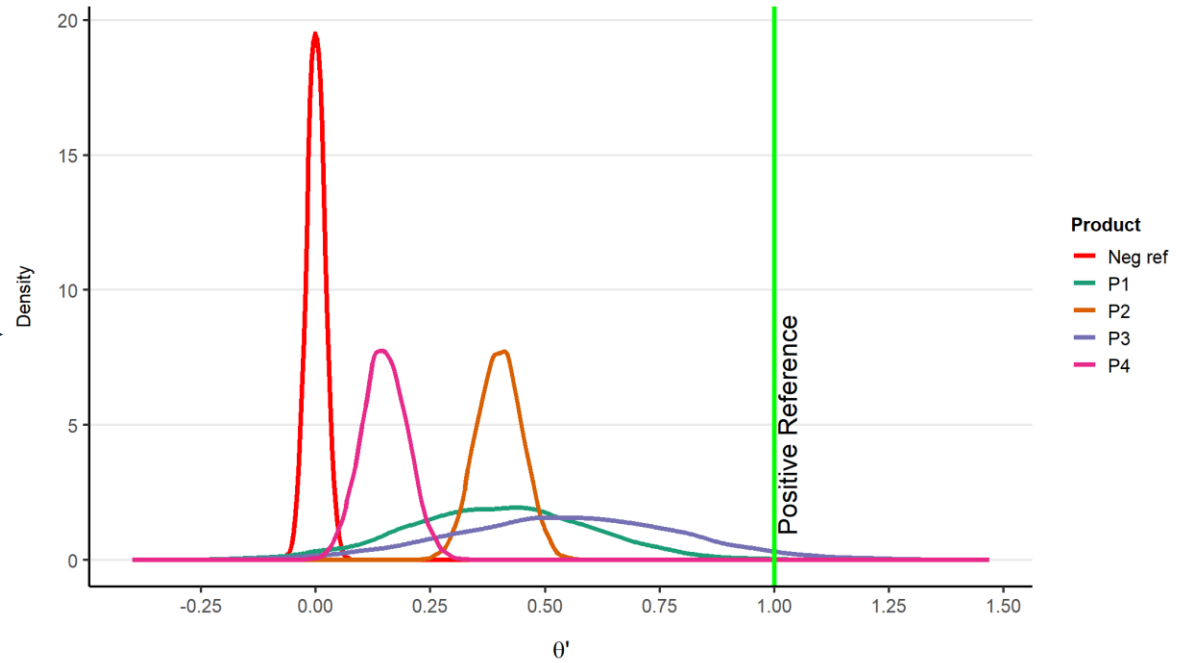
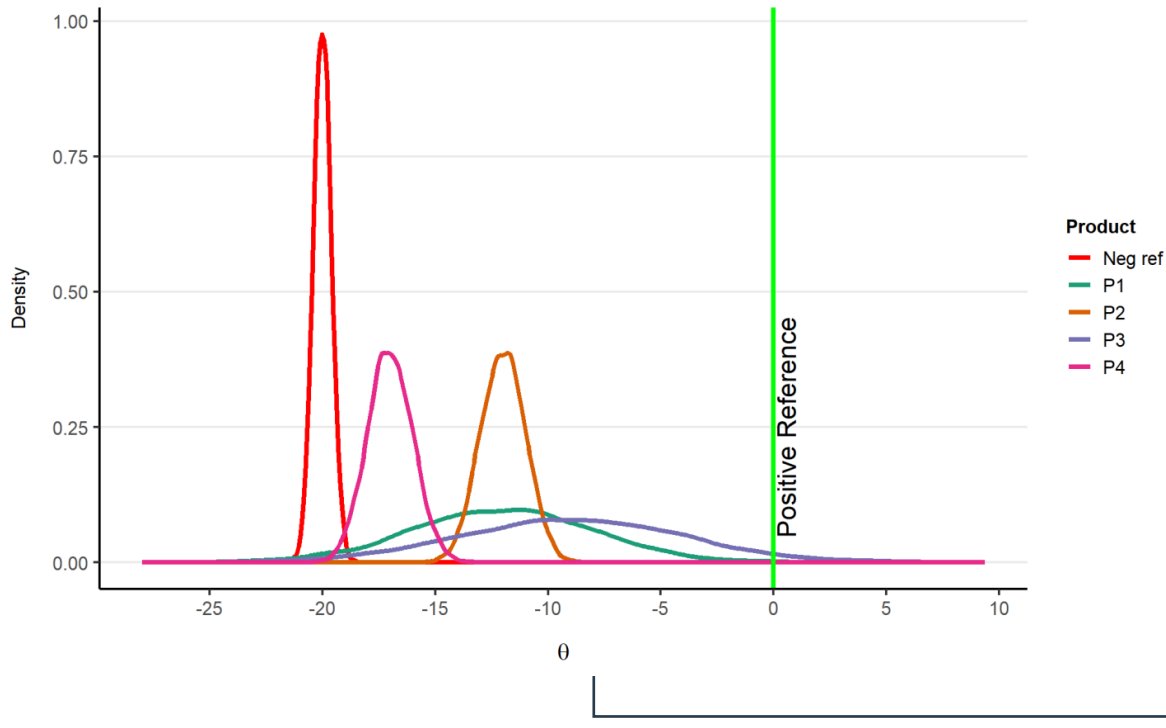
# Context and data

- Overall comparison of posterior mean efficacy distributions of 4 products with regards to
  - One positive reference: maximum possible efficacy (not achievable in practice)
  - One negative reference: fifth product known to have the worst efficacy
- Each comparison summarized by one unique metric (then used to rank products)
- **Minimal risk mindset to define the metric; the best product must present a trade-off between having**
  - 1) high probability to be above the negative reference
  - 2) small uncertainty on the posterior distributions
  - 3) high chances to be like the positive reference



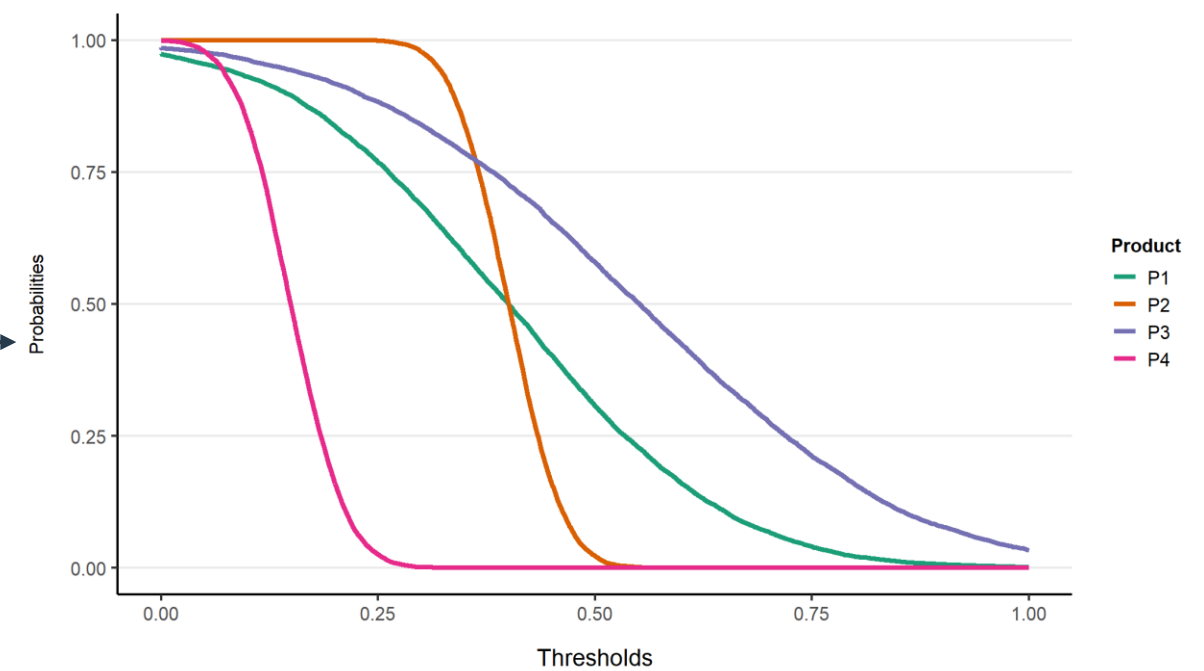
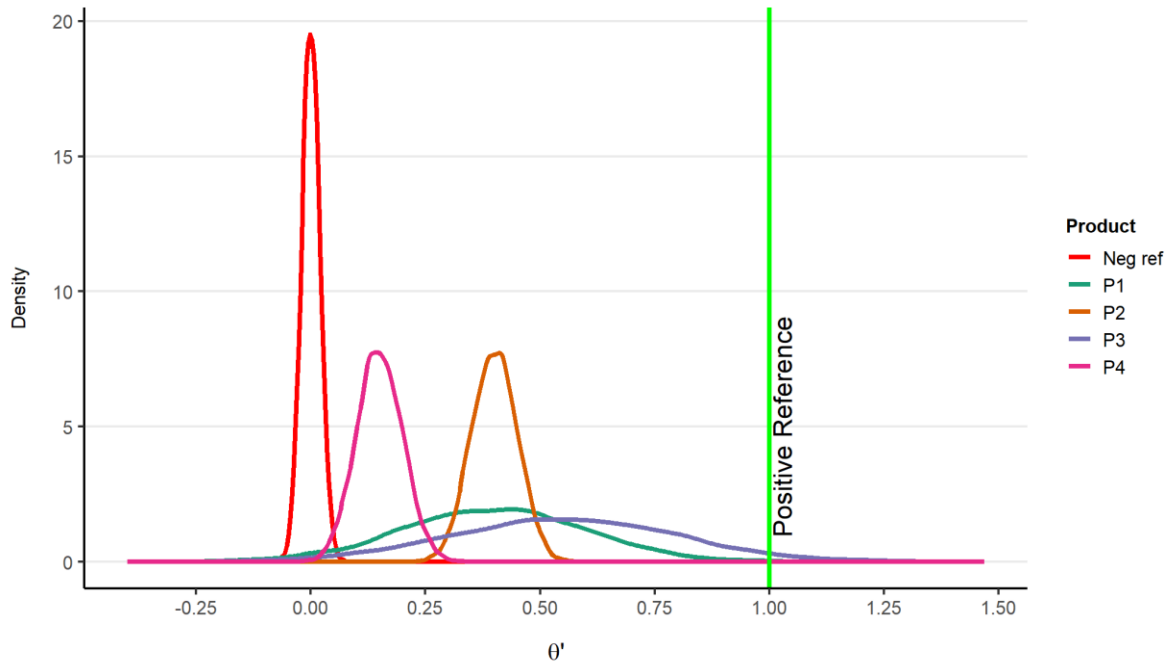
# Step 1: (Quasi-)Normalization

- Make the range of the  $\theta_i$  independent of the data
- Following steps can be run the same way for every data



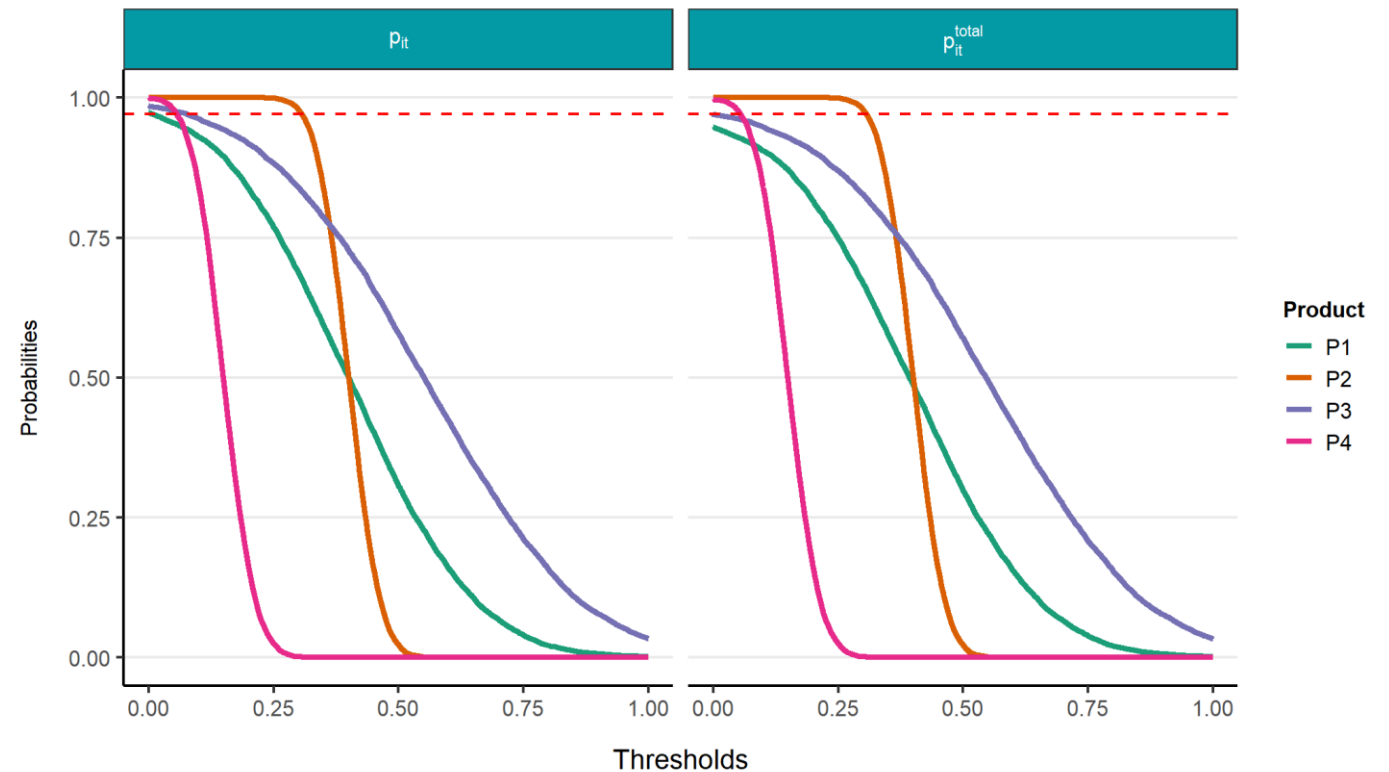
# Step 2: Probabilities to be comparable

- Compute the probabilities for a product to be comparable to the positive reference accounting for its variability
- It is the inverse of the cumulative distribution function for each product



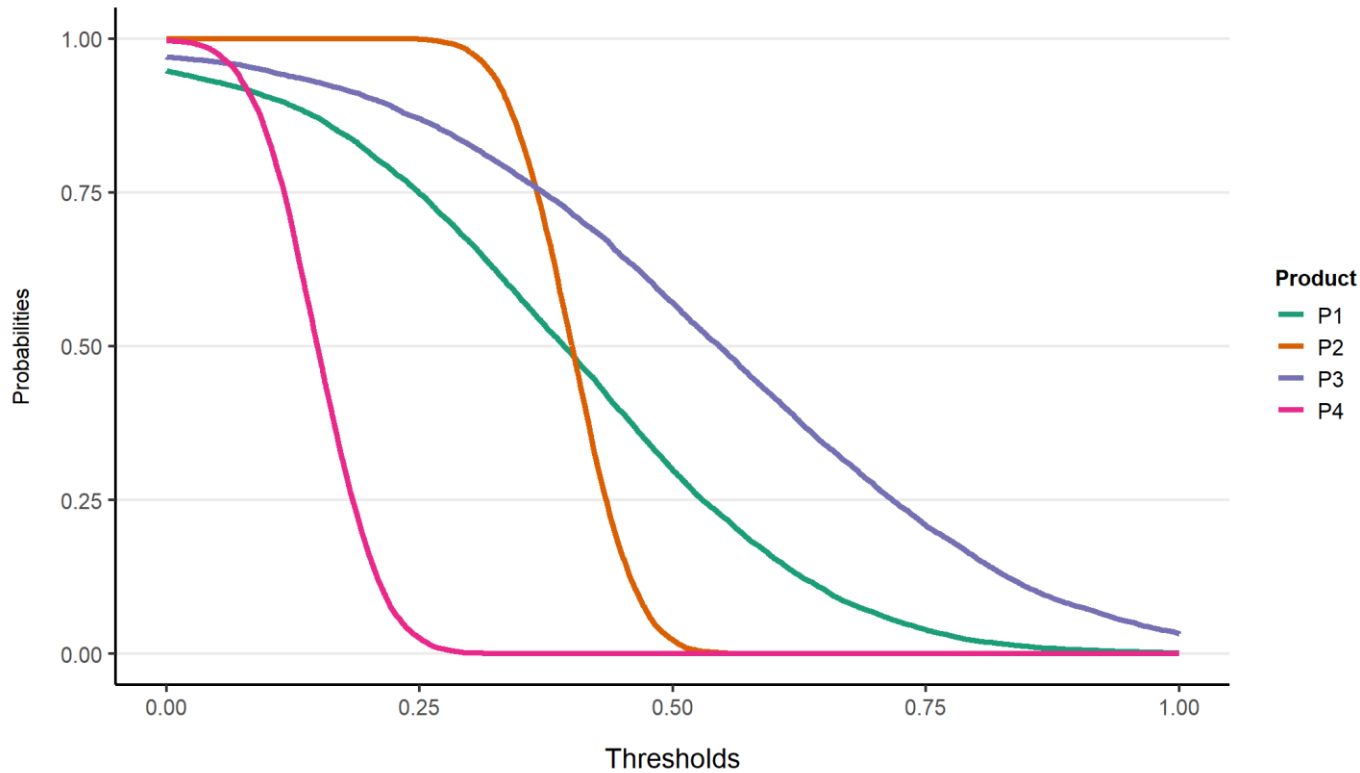
## Step 3: Penalization of probabilities in step 2

- Penalized products that have a non-negligible probability to underperform the negative reference
- They represent higher risk
- For each product, the penalization factor is multiplied by the probabilities derived in step 2



# Step 4: Metric calculation

▶ AUC ?

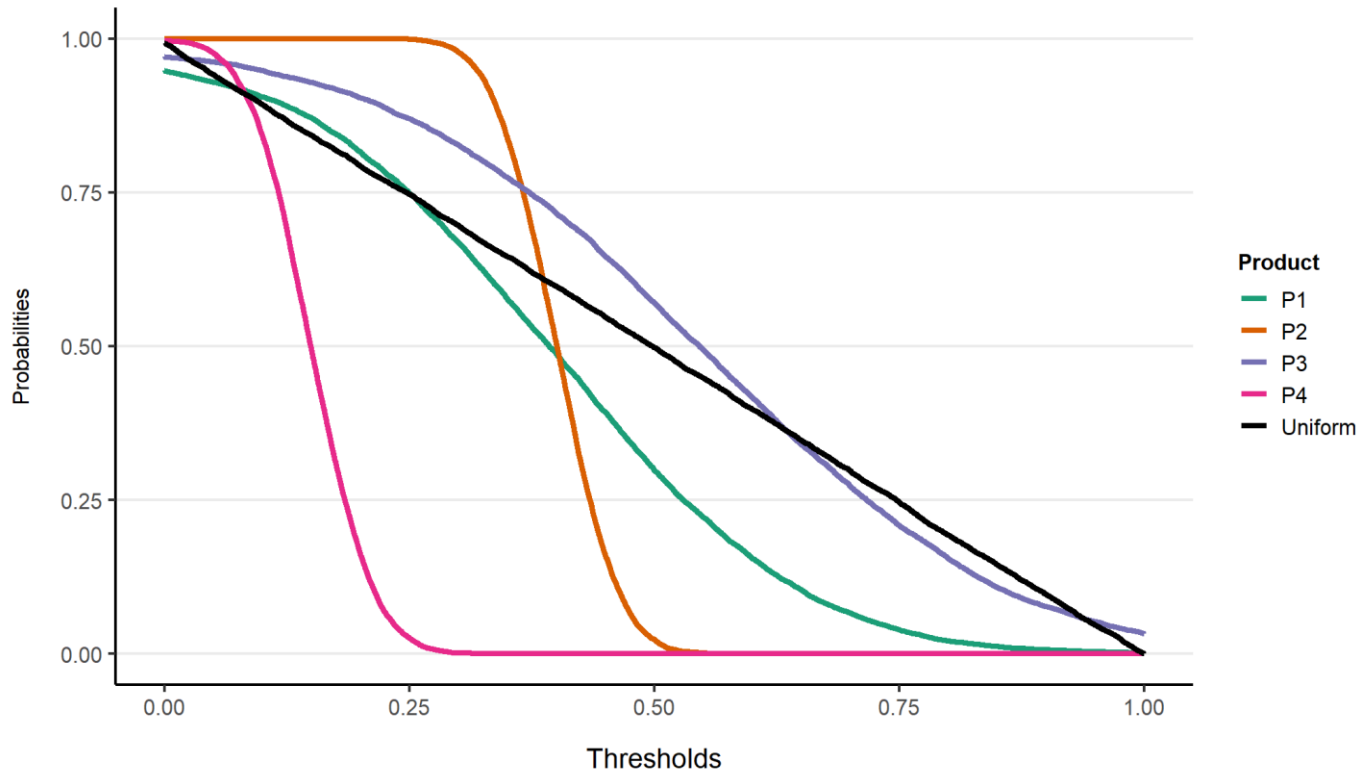


Product	M	SD	P2	AUC
P3	-12.03	4.04	98.480	0.539
P2	-12.00	1.00	100.000	0.400
P1	-9.01	5.00	97.320	0.390
P4	-17.00	1.00	99.760	0.150



# Step 4: Metric calculation

➤ AUC considering the hypothetical case of no knowledge as represented by a uniform distribution



Product	M	SD	P2	Metric	AUC
<b>P2</b>	<b>-12.00</b>	<b>1.00</b>	<b>100.000</b>	<b>0.127</b>	<b>0.400</b>
<b>P3</b>	<b>-12.03</b>	<b>4.04</b>	<b>98.480</b>	<b>0.103</b>	<b>0.539</b>
<b>P1</b>	<b>-9.01</b>	<b>5.00</b>	<b>97.320</b>	<b>0.007</b>	<b>0.390</b>
<b>P4</b>	<b>-17.00</b>	<b>1.00</b>	<b>99.760</b>	<b>0.004</b>	<b>0.150</b>

► PHARMALEX

# Thank you!

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