

SCIENTIFIC
REGISTRY OF
TRANSPLANT
RECIPIENTS

# Historical Priors for Bayesian Assessment of Transplant Program Performance

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**Grace Lyden, PhD Hennepin Healthcare Research Institute, Minneapolis, MN** 

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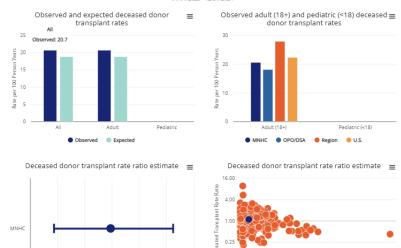
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## **Background**

- The Scientific Registry of Transplant Recipients (SRTR) publishes transplant program evaluations every 6 months
- Observed-to-Expected (O-to-E) ratios for:
  - Graft failures, pretransplant deaths, accepted offers, transplants, etc
  - "Expected" is derived from national riskadjusted models

#### Deceased Donor Transplant Rates





Estimated Transplant Rate Ratio

Person Years

Other Centers MNHC

## **Background**

- Bayesian methodology:
  - Prior for rate ratio: gamma(2,2)
    - Prior mean = 1 (as expected)
  - Posterior for rate ratio: gamma(O+2, E+2)
    - Posterior mean: (O+2) / (E+2)
    - Shrinks O/E ratio toward 1
- Posterior distribution → Tier assignment
  - (Tier 1 = worst, Tier 5 = best)

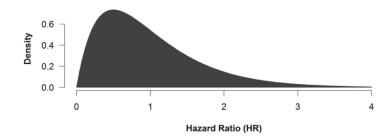


Figure 3: Gamma prior with mean of 1.0 and variance of 0.5 (SD = 0.71). The hazard ratio for each program is on the x-axis. A hazard ratio of 1 indicates a program that is performing exactly as expected and a hazard ratio of 2 a program with twice as many events as expected. The y-axis (labeled "Density") shows how frequent we believe this hazard ratio to be across all programs.

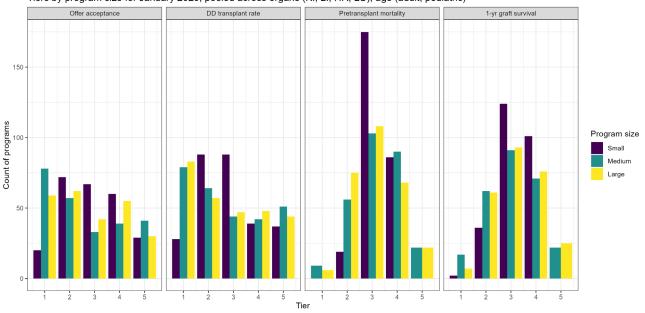


## **Motivation: Small Programs**

- Gamma(2,2) prior pulls programs toward a mean of 1 (performing as expected)
  - Small programs have fewer observed data to pull their evaluations away from 1
- → More difficult for small programs to achieve the top tier

## **Motivation: Small Programs**





#### **Methods: Historical Priors**

Define  $O_{past}$  and  $E_{past}$ :

 $O_{past}$ : Observed count of events from most recent nonoverlapping cycle

 $E_{past}$ : Expected count of events from most recent nonoverlapping cycle

#### **Proposed Methodology:**

Prior is an average of gamma(2,2) and gamma( $O_{past} + 2$ ,  $E_{past} + 2$ ):

gamma(
$$\frac{O_{past}}{2} + 2, \frac{E_{past}}{2} + 2$$
)

Posterior is therefore:

gamma(0 + 
$$\frac{o_{past}}{2}$$
 + 2,  $E + \frac{E_{past}}{2}$  + 2)

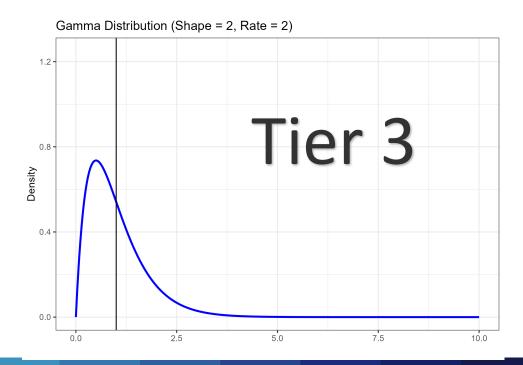
# **Example**

• This is a trajectory of offer acceptance evaluations for a small adult heart program:

Cycle	Date range	Observed offers accepted	Expected offers accepted	Published SRTR tier rating (1-5)
July 2023	January 2022–December 2022	9	3.6	5
January 2024	July 2022–June 2023	14	7.4	4
July 2024	January 2023–December 2023	14	7.5	4
January 2025	July 2023–June 2024	10	5.6	4

# **Example: Current Methodology**

Prior: gamma(2,2)



# **Example: Current Methodology**

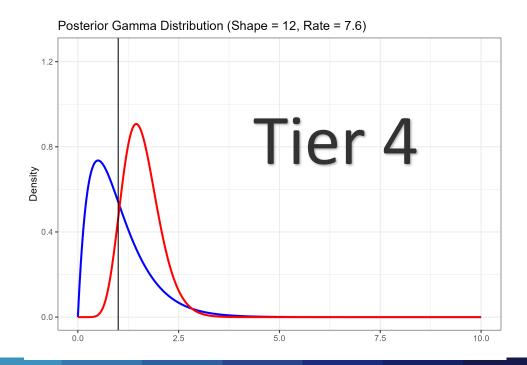
Prior: gamma(2,2)

Observed: 10

Expected: 5.6

 $\rightarrow$ 

**Posterior**: gamma(10+2, 5.6+2)



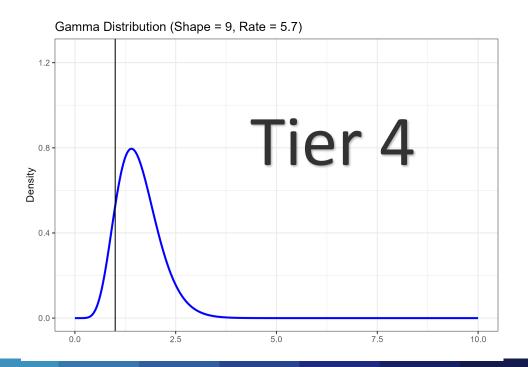
#### **Example: Historical Priors**

In January 2024 cycle:

Observed: 14

Expected: 7.4

**Prior**: gamma(14/2 + 2, 7.4/2 + 2) = gamma(9, 5.7)



#### **Example: Historical Priors**

In January 2024 cycle:

Observed: 14

Expected: 7.4

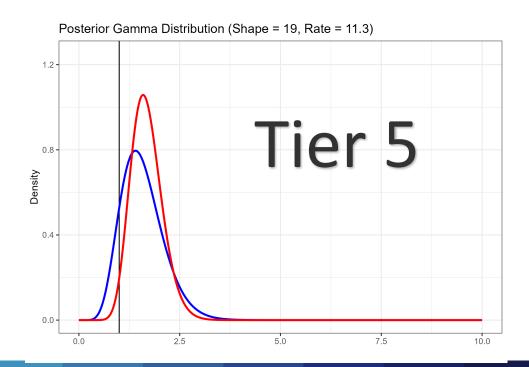
**Prior**: gamma(9, 5.7)

Observed: 10

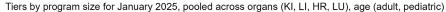
Expected: 5.6

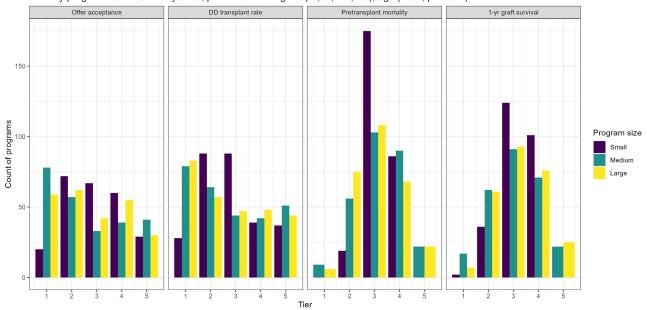
 $\rightarrow$ 

**Posterior**: gamma(10+9, 5.6+5.7)

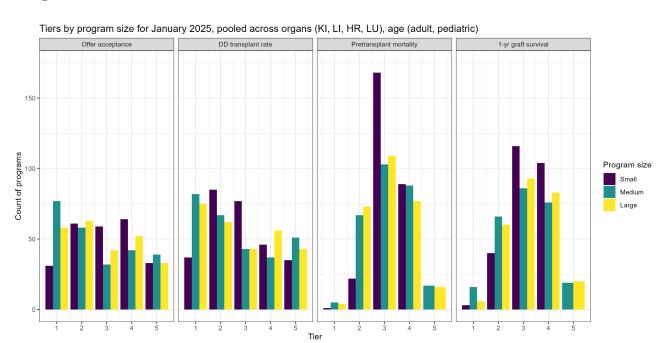


# **January 2025 Tiers**





# **January 2025 Tiers with Historical Priors**



#### **Simulation Results**

#### **Strengths of historical priors**

- Tiers more stable over time, especially if program performance is constant over time; programs do not "bounce" around tiers from cycle to cycle
- More likely to assign Tier 5 to a small program that performs consistently well over time
- More likely to flag a small program that consistently performs poorly

#### Weaknesses of historical priors

- Less likely to flag a small program that recently got worse (ie, historical performance was better than current performance)
- Less likely to assign Tier 5 to a small program that recently improved (ie, cannot jump into Tier 5)

Debatable whether these are weaknesses or strengths!

#### **Conclusions**

Use of historical priors would:

- Increase precision (more informative prior)
- Shift smaller transplant programs toward outer tiers based on past performance
- Align more closely with Bayesian principles
- Perhaps enable smaller programs to achieve the top tier

Community input and Membership and Professional Standards Committee (MPSC) feedback will be essential to determine:

 Is it appropriate for historical data (from a program's most recent nonoverlapping cycle) to influence the program's current evaluations and tier ratings?



#### Transplantation

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# Nonoverlapping cycles, for January 2025

• Offer acceptance: 1-year cohorts

July 2022 June 2023 July 2023 June 2024

Transplant rate and pretransplant mortality: 2-year cohorts

July 2020 June 2022 July 2022 June 2024

1-year graft survival: 2.5-year cohorts

January 2019 June 2021 July 2021 December 2023