



SCIENTIFIC
REGISTRY OF
TRANSPLANT
RECIPIENTS

Real-World Evidence Submission: A Case Study in Lung Transplantation

Tim Weaver, MS

SRTR Background

The Chronic Disease Research Group (CDRG) is a division of Hennepin Healthcare Research Institute (HHRI)

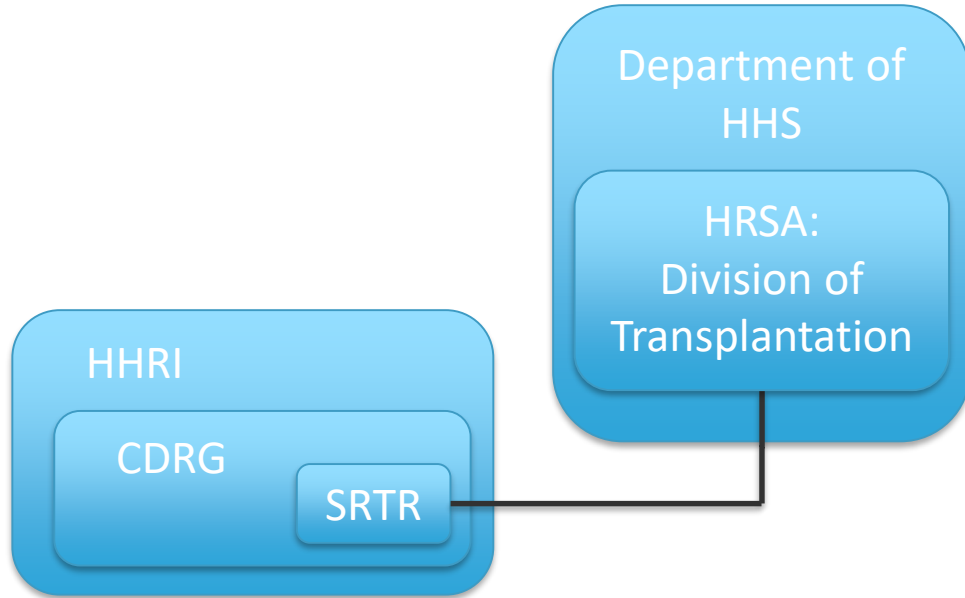


SRTR Background

CDRG operates the Scientific Registry of Transplant Recipients (SRTR)

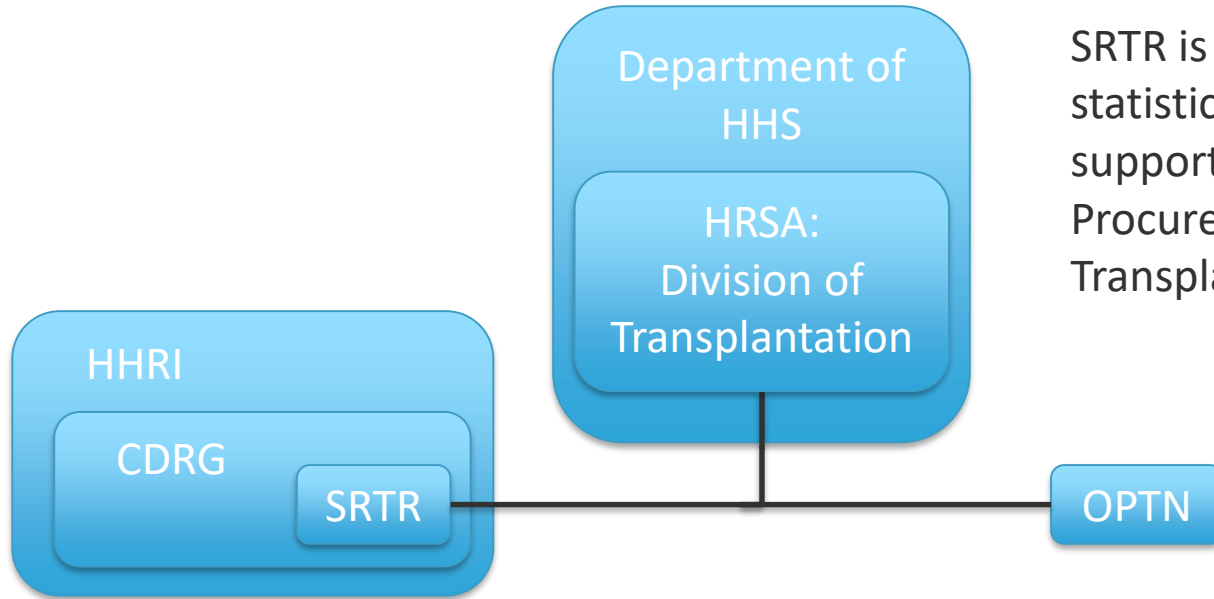


SRTR Background



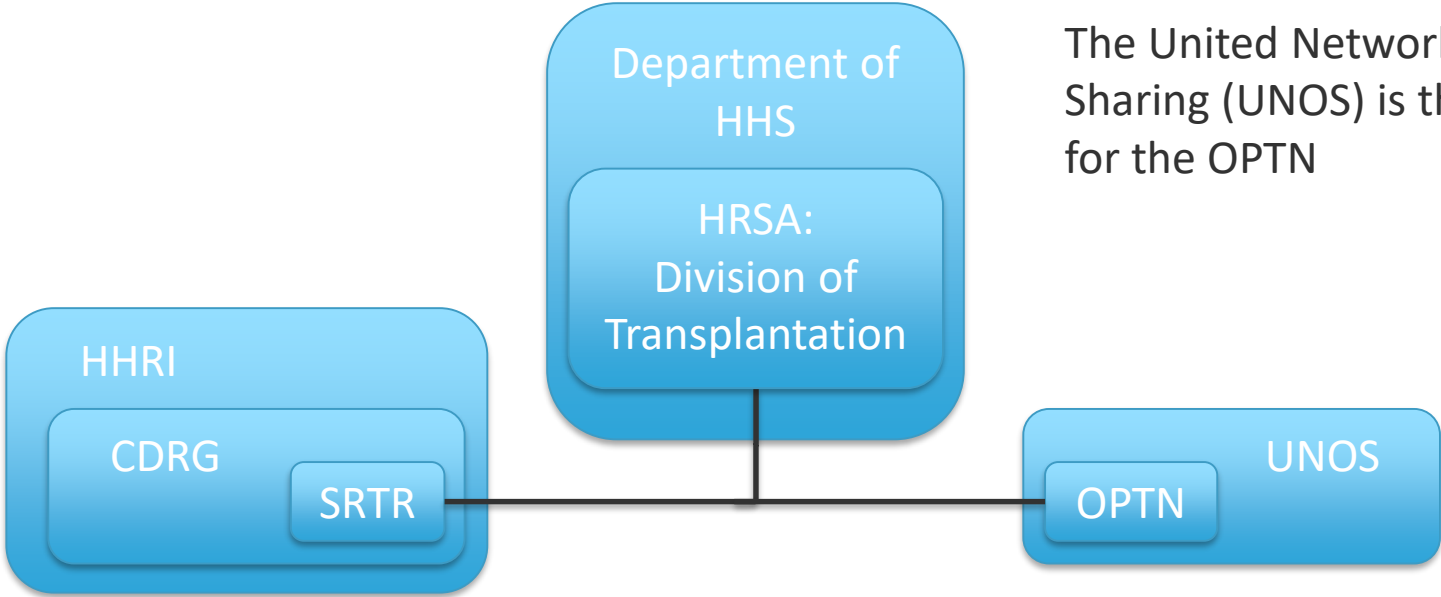
CDRG operates the SRTR under contract from the Division of Transplantation, Healthcare Systems Bureau, Health Resources and Services Administration (HRSA), US Department of Health and Human Services (HHS)

SRTR Background



SRTR is responsible for providing statistical and other analytic support to the Organ Procurement and Transplantation Network (OPTN)

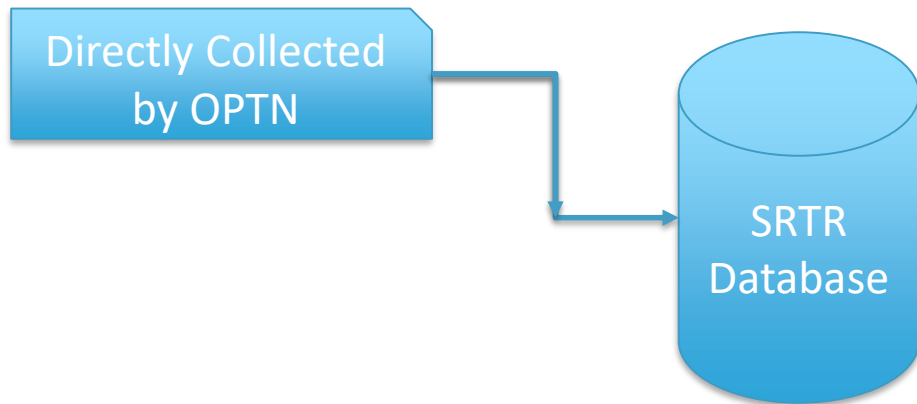
SRTR Background



The United Network for Organ Sharing (UNOS) is the contractor for the OPTN

The SRTR Database

Primary Data Source



The SRTR Database

Primary Data Source

Directly Collected
by OPTN

Supplementary Data
Sources

Centers for Medicare
& Medicaid Services

National Technical
Information Service's
Death Master File



The SRTR Database

Primary Data Source

Directly Collected
by OPTN

Supplementary Data Sources

Centers for Medicare
& Medicaid Services

National Technical
Information Service's
Death Master File



The US Department of Health and Human Services (HHS) Final Rule requires:

- SRTR make all data available to the public while honoring applicable statutes and requirements for patient privacy
- SRTR to respond to requests from the public for data needed for bona fide research or analytic purposes, to assess the performance of HRSA contractors and transplant programs, and for other purposes

The SRTR Database

Primary Data Source

Directly Collected
by OPTN

Supplementary Data Sources

Centers for Medicare
& Medicaid Services

National Technical
Information Service's
Death Master File



Publicly
Released
Data

Standard Analysis Files
(SAFs)

Program Specific
Reports (PSRs)

OPO-Specific Reports
(OSRs)

Annual Data Report
(ADR)

Articles and
Presentations

The SRTR Database

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By
Request
To:

HRSA

CMS

Private Insurance
Providers

OPTN Committees

External Investigators
and the Public



The SRTR Database

OPTN Data Sources:

- Transplant programs
- OPOs
- Histocompatibility laboratories

Internet-based System, Unet, allows transplant programs to:

- Register candidates for transplant
- Match donated organs to candidates
- Submit data on donors, candidates, and recipients before and after transplant

Primary Data Source

Directly Collected
by OPTN

Supplementary Data
Sources

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National Technical
Information Service's
Death Master File

SRTR
Database

```
graph LR; A[Directly Collected by OPTN] --> D[(SRTR Database)]; B[Centers for Medicare & Medicaid Services] --> D; C[National Technical Information Service's Death Master File] --> D;
```

The SRTR Database

UNet system includes information on every transplant and organ donation that has occurred in the US since October 1, 1987

Primary Data Source

Directly Collected
by OPTN

Supplementary Data Sources

Centers for Medicare
& Medicaid Services

National Technical
Information Service's
Death Master File

SRTR
Database

```
graph LR; A[Directly Collected by OPTN] --> D[(SRTR Database)]; B[Centers for Medicare & Medicaid Services] --> D; C[National Technical Information Service's Death Master File] --> D;
```

Observational Data

This study relied on the observational data from the SRTR database

Compared to a clinical trial there is a tradeoff between breadth and depth of the data

The image shows a screenshot of a 'Patient Status' worksheet form. The form is titled 'Patient Status' and contains several sections with input fields and radio button options. The sections are: 'Date: Last Seen, Retransplanted or Death' with a text input field; 'Patient Status' with radio buttons for LIVING, DEAD, RETRANSPANTED, and NOT SEEN; 'Primary Cause of Death' with a text input field and a 'Specify:' field; 'Contributory Cause of Death' with a text input field and a 'Specify:' field; 'Contributory Cause of Death' with a text input field and a 'Specify:' field; 'Has the patient been hospitalized since the last patient status date' with radio buttons for YES, NO, and UNK; 'Hospitalized for Rejection' with radio buttons for YES, NO, and UNK; 'Hospitalized for Infection' with radio buttons for YES, NO, and UNK; 'Functional Status' with a text input field; and 'Working for income' with radio buttons for YES, NO, and UNK.

Detail of: "Adult Thoracic Transplant Recipient Follow-Up Worksheet"

Observational Data

Patient Status	
Date: Last Seen, Re-transplanted or Death*	<input type="text"/>
	<input type="radio"/> LIVING
	<input type="radio"/> DEAD
Patient Status:*	<input type="radio"/> RETRANSPLANTED
	<input type="radio"/> NOT SEEN
Primary Cause of Death:	<input type="text"/>
Specify:	<input type="text"/>
Contributory Cause of Death:	<input type="text"/>
Specify:	<input type="text"/>
Contributory Cause of Death:	<input type="text"/>
Specify:	<input type="text"/>
Has the patient been hospitalized since the last patient status date:*	<input type="radio"/> YES <input type="radio"/> NO <input type="radio"/> UNK
Hospitalized for Rejection:	<input type="radio"/> YES <input type="radio"/> NO <input type="radio"/> UNK
Hospitalized for Infection:	<input type="radio"/> YES <input type="radio"/> NO <input type="radio"/> UNK
Functional Status:*	<input type="text"/>
Working for income:*	<input type="radio"/> YES <input type="radio"/> NO <input type="radio"/> UNK

Detail of: "Adult Thoracic Transplant Recipient Follow-Up Worksheet"

Primary Data Source

Directly Collected
by OPTN

Supplementary Data
Sources

Centers for Medicare
& Medicaid Services

National Technical
Information Service's
Death Master File

SRTR
Database

Observational Data

The SRTR database is broad; recall it includes information on *every* transplant and organ donation that has occurred in the US since October 1, 1987

Information is (mostly) limited to the specific questions (and wording) on the collection forms; thus the database information is not always deep

The image shows a screenshot of a 'Patient Status' form. The form is titled 'Patient Status' and contains several sections with input fields and radio button options. The sections are: 'Date: Last Seen, Retransplanted or Death' with a text input field; 'Patient Status' with radio buttons for LIVING, DEAD, RETRANSPLANTED, and NOT SEEN; 'Primary Cause of Death' with a text input field and a 'Specify:' sub-field; 'Contributory Cause of Death' with a text input field and a 'Specify:' sub-field; 'Contributory Cause of Death' with a text input field and a 'Specify:' sub-field; 'Has the patient been hospitalized since the last patient status date' with radio buttons for YES, NO, and UNK; 'Hospitalized for Rejection' with radio buttons for YES, NO, and UNK; 'Hospitalized for Infection' with radio buttons for YES, NO, and UNK; 'Functional Status' with a text input field; and 'Working for income' with radio buttons for YES, NO, and UNK.

Detail of: “Adult Thoracic Transplant Recipient Follow-Up Worksheet”

Observational Data: Outcomes

The data collection guidelines and wording of questions determined the form the analysis could take

OPTN Policy “18.1 Data Submission Requirements” states: The organ specific transplant recipient follow-up (TRF) must be submitted to the OPTN within either of the following:

- 30 days after the six-month and annual anniversary of the transplant date until the recipient’s death or graft failure
- 14 days from notification of the recipient's death or graft failure

The screenshot shows a form titled "Patient Status" with the following fields and options:

- Date: Last Seen, Retransplanted or Death***: [Text Input Field]
- Patient Status:***: LIVING, DEAD, RETRANSPLANTED, NOT SEEN
- Primary Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Contributory Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Contributory Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Has the patient been hospitalized since the last patient status date:***: YES NO UNK
- Hospitalized for Rejection:** YES NO UNK
- Hospitalized for Infection:** YES NO UNK
- Functional Status:***: [Text Input Field]
- Working for income:***: YES NO UNK

Detail of: “Adult Thoracic Transplant Recipient Follow-Up Worksheet”

Observational Data: Outcomes

Transplant recipient follow-up (TRF) must be submitted within 14 days of death/GF

The TRF asks for a specific death date and GF date (not shown)

This allowed for time to event analysis for death and GF outcomes:

- Kaplan-Meier survival estimates
- Proportional hazard models

The screenshot shows a form titled "Patient Status" with the following fields and options:

- Date: Last Seen, Retransplanted or Death***: A text input field.
- Patient Status:***: Radio button options for **LIVING**, **DEAD**, **RETRANSPLANTED**, and **NOT SEEN**.
- Primary Cause of Death:**: A text input field with a **Specify:** sub-field below it.
- Contributory Cause of Death:**: A text input field with a **Specify:** sub-field below it.
- Contributory Cause of Death:**: A text input field with a **Specify:** sub-field below it.
- Has the patient been hospitalized since the last patient status date:***: Radio button options for **YES**, **NO**, and **UNK**.
- Hospitalized for Rejection:**: Radio button options for **YES**, **NO**, and **UNK**.
- Hospitalized for Infection:**: Radio button options for **YES**, **NO**, and **UNK**.
- Functional Status:***: A text input field.
- Working for income:***: Radio button options for **YES**, **NO**, and **UNK**.

Detail of: "Adult Thoracic Transplant Recipient Follow-Up Worksheet"

Observational Data: Outcomes

Without death or GF the TRF must be submitted within 30 days after the six-month and annual anniversary of the transplant date until the recipient's death or graft failure

The TRF does not ask for specific dates of other outcomes

The screenshot shows a form titled "Patient Status" with the following fields and options:

- Date: Last Seen, Retransplanted or Death***: [Text Input Field]
- Patient Status:***:
 - LIVING
 - DEAD
 - RETRANSPLANTED
 - NOT SEEN
- Primary Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Contributory Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Contributory Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Has the patient been hospitalized since the last patient status date:***:
 - YES NO UNK
- Hospitalized for Rejection:** YES NO UNK
- Hospitalized for Infection:** YES NO UNK
- Functional Status:***: [Text Input Field]
- Working for income:***: YES NO UNK

Detail of: "Adult Thoracic Transplant Recipient Follow-Up Worksheet"

Observational Data: Outcomes

Time-to-event analysis was not possible for other outcomes

The analysis was presented as a “crude cumulative incidence percent”

The number of events in 0-1y, 0-2y, 0-3y post-transplant divided by the total number of recipients

The events from year one are counted in years two and three and likewise for year two

The screenshot shows a form titled "Patient Status" with the following fields and options:

- Date: Last Seen, Retransplanted or Death***: [Text Input Field]
- Patient Status:***:
 - LIVING
 - DEAD
 - RETRANSPLANTED
 - NOT SEEN
- Primary Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Contributory Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Contributory Cause of Death:** [Text Input Field]
Specify: [Text Input Field]
- Has the patient been hospitalized since the last patient status date:***: YES NO UNK
 - Hospitalized for Rejection:** YES NO UNK
 - Hospitalized for Infection:** YES NO UNK
- Functional Status:***: [Text Input Field]
- Working for income:***: YES NO UNK

Detail of: “Adult Thoracic Transplant Recipient Follow-Up Worksheet”

Observational Data: Drug Regimen

The data collection process also influenced the assignment of drug regimen

This is recorded on the transplant recipient registration (TRR) form

OPTN Policy “18.2 Timely Collection of Data” states: the information for the TRR must be collected:

- when the transplant recipient is discharged from the hospital or
- 42 days following the transplant date, whichever is first

Drugs primarily used for maintenance	Ind.	Days	ST	Maint	AR
Cyclosporine, select from the following:					
- Gengraf	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Neoral	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Sandimmune	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Generic cyclosporine	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Imuran (azathioprine, AZA)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Leflunomide (LFL)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Mycophenolic acid, select from the following:					
- CellCept (MMF)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Generic MMF (generic CellCept)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Myfortic (mycophenolic acid)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Generic Myfortic (generic mycophenolic acid)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
mTOR inhibitors, select from the following:					
- Rapamune (sirolimus)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Generic sirolimus	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Zortress (everolimus)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Nulojix (belatacept)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Tacrolimus, select from the following:					
- Astagraf XL (extended release tacrolimus)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Envarsus XR (tacrolimus XR)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>

Detail of: “Adult Thoracic - Lung Transplant Recipient Registration Worksheet”

Observational Data: Drug Regimen

Ideally, we would like to know drug regimen from transplant but that is not available

The dataset is left-truncated prior to hospital discharge

This is a standard data condition for the KM estimator and was handled in PH regression models by including length of hospital stay as an adjustment factor

Drugs primarily used for maintenance	Ind.	Days	ST	Maint	AR
Cyclosporine, select from the following:					
- Gengraf	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Neoral	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Sandimmune	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Generic cyclosporine	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Imuran (azathioprine, AZA)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Leflunomide (LFL)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
Mycophenolic acid, select from the following:					
- CellCept (MMF)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Generic MMF (generic CellCept)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Myfortic (mycophenolic acid)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Generic Myfortic (generic mycophenolic acid)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
mTOR inhibitors, select from the following:					
- Rapamune (sirolimus)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Generic sirolimus	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
- Zortress (everolimus)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
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- Astagraf XL (extended release tacrolimus)	<input type="checkbox"/>	<input type="text"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
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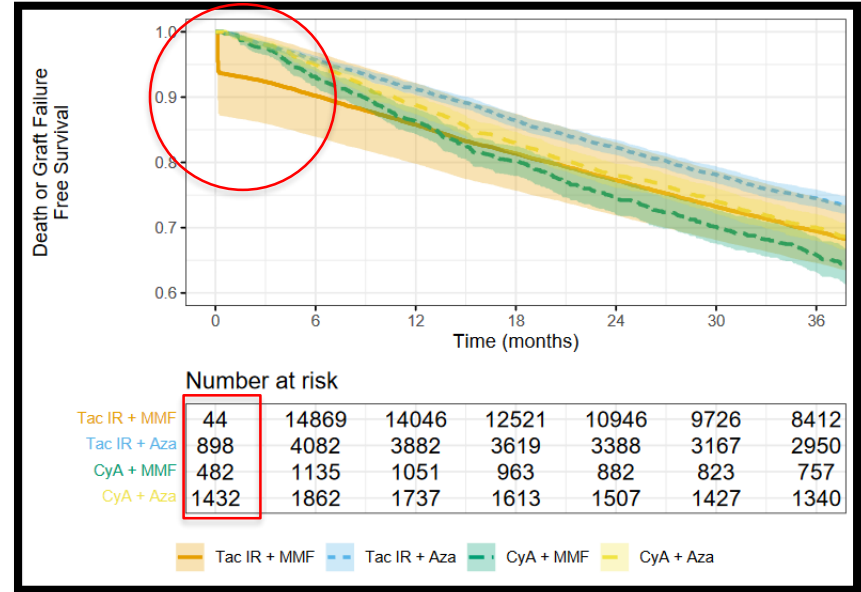
Detail of: "Adult Thoracic - Lung Transplant Recipient Registration Worksheet"

Framing the Analysis Questions

The TRR collection process led to a left-truncated dataset

4 recipients in the Tac IR + MMF group had early discharge and death

This had an outsized impact on the survival estimates



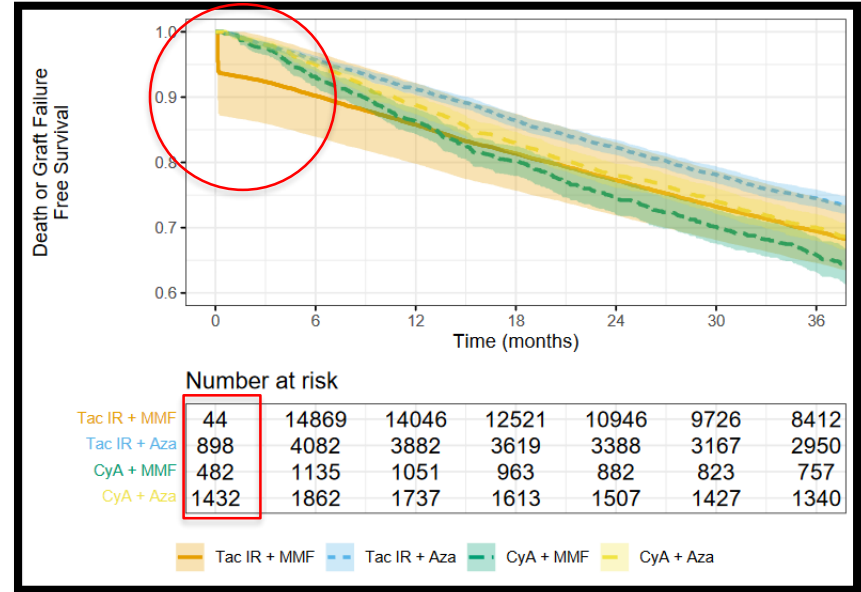
No Adjustment

Framing the Analysis Questions

What is the medical rationale for these 4 early events?

- Perhaps they were “discharged” to a different unit at the hospital
- Perhaps it was ...

Ultimately, the medical rationale cannot be determined from the data available

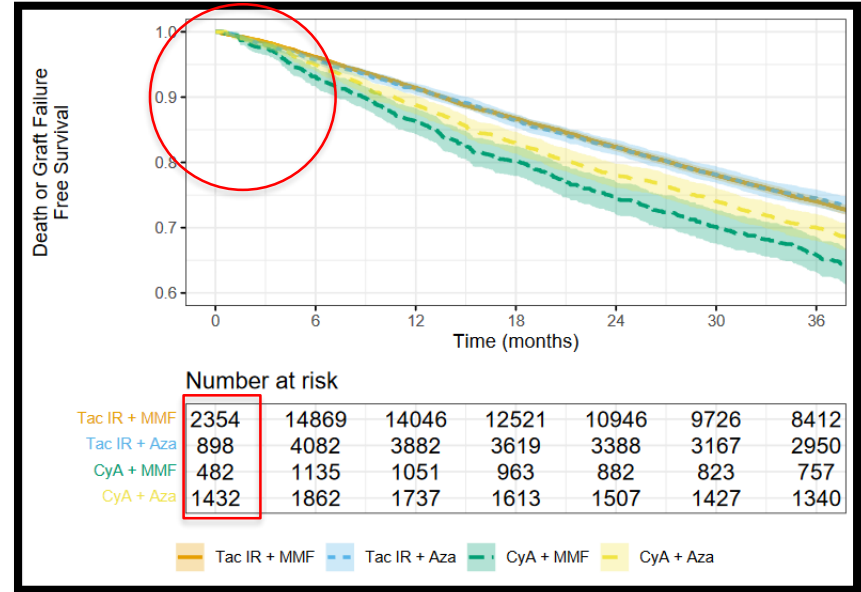


Left Truncation: No Adjustment

Framing the Analysis Questions

Had to reframe to question address the impact of these 4 recipients

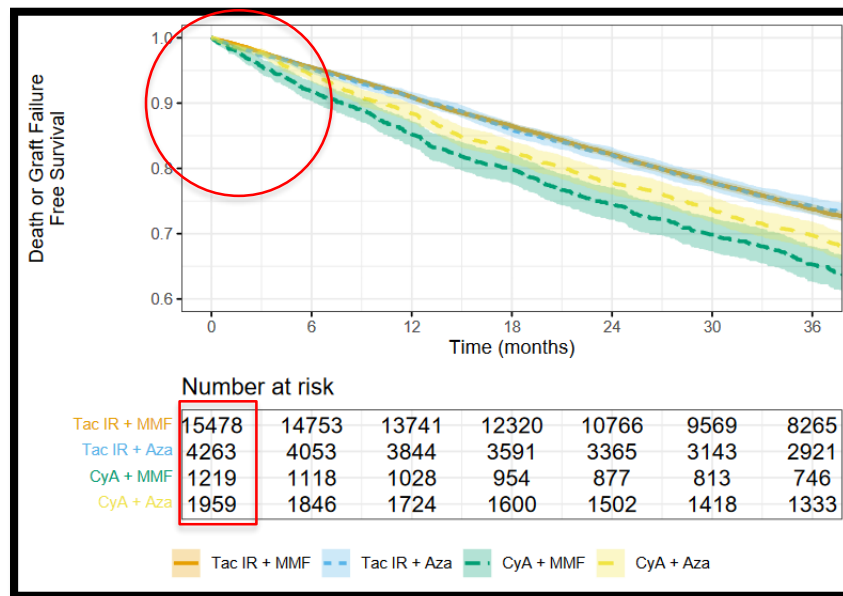
Shifting their event date ahead to the earliest of the other groups (10 days post transplant)



Left Truncation: Shifted Early Events

Framing the Analysis Questions

Treating the discharge date as the start of time at-risk



At-Risk Time Starts at Discharge

Technical Aspects

All analysis performed in markdown, which interweaves code and text and allows:

- One-to-one tie between code and results
- Few(er) intermediary datasets

Utilized software development practices:

- Modularity: common functions were reused throughout the reporting
- `dplyr` paradigm for subgroup calculations allows readability and consistency
- Documented code review via GitLab merge requests





Transplantation

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