

Statistical Techniques to Analyze Late Phase Studies involving Categorical Efficacy and Safety Data Using SAS® Programming

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- ✱ Categorical Efficacy and Safety endpoints are always important to analyze with the correct justification
 - ❖ Correct statistical techniques are used
 - ❖ Check for required assumption
- ✱ Complex to analyze categorical variables in late phase study endpoints
- ✱ Presenting of categorical endpoints and related statistical estimates
 - ❖ Tables and graphs
- ✱ Proper interpretation of Statistical estimates

Statistical techniques to Analyze Categorical Endpoints

- ✧ A contingency table analysis is used to examine the relationship between two categorical variables
- ✧ Commonly used statistical estimates
 - ❖ P-Value
 - ❖ Odds
 - ❖ Odds Ratio
 - ❖ Relative Risk
- ✧ Commonly used statistical methods
 - ❖ Binary Logistic Regression
 - ❖ Multi- Nominal Logistic Regression
- ✧ Graphic Presentation
 - ❖ Dot Plot - Preferred Term Vs. Rate of Incident
 - ❖ Forest Plot - Preferred Term Vs. Relative Risk
 - ❖ Butterfly Plot - Preferred Term Vs. Rate of Incident to Compare Severity

Statistical Tests used for Categorical Clinical Endpoints



- ✂ Binomial Test
- ✂ Chi-Square Test
- ✂ Fisher's Exact Test
- ✂ Cochran-Mantel-Haenszel (CMH) Test
- ✂ McNemar Test

✂ Safety Data:

- ❖ AETERM(Adverse Events Terms)
- ❖ CMTERM(Concomitant Terms)
- ❖ Laboratory, Vital, ECG Potential clinical importance (PCI)

✂ Efficacy Data:

✂ Nephrology -

- ❖ Graft Loss (Clinical immunology Loss of function in a transplanted organ or tissue)
- ❖ GFR (Glomerular filtration rate)
- ❖ BCAR(Biopsy Confirmed Acute Rejection)

❖ Oncology -

- ❖ Overall Response Rate
- ❖ Best Overall Response Rate
- ❖ Survival Status (Death and alive)

Title	Open label, randomized, comparative, multicenter, Phase IIIB/IV
Primary Object	Percent of subjects who demonstrate a greater than or equal to 5 ml/min/1.73m ² improvement in calculated GFR from Randomization to 2 and 6 months post-transplant.
Secondary Objective(s)	To evaluate the safety of planned transition to TPHUSE001 from TPHUSE002. Safety analysis include following endpoints : ❖ Exposure and compliance. ❖ Subject and graft survival from randomization to 2 months and 6 months post transplantation . ❖ Severity of first BCAR. ❖ Adverse events and Treatment emergent adverse events. ❖ Safety laboratory evaluation and vital signs. ❖ Non-study medication

Q1: What statistical technique could be used to compare the outcome and treatment group?

✂ Outcome:

❖ Improvement: Yes or No

✂ Treatment Group:

❖ TPHUSE001 and TPHUSE002

✳ Fisher's exact test Assumptions:

- ❖ Should have two variables, both should be categorical and should be dichotomous outcomes.
- ❖ Observations are independent of each other.

Percent of subjects who demonstrated a $\geq 5 \text{ ml/min/1.73m}^2$ improvement in calculated GFR from Post Transplantation to 2 and 6 months

Time	Improvement	TPHUSE001 (N=200) n (%)	TPHUSE002 (N=180) n (%)	Odds Ratio 95% CI	P-value
2 Months	GFR	4 (2.0 %)	6 (3.4 %)	0.592 (0.164, 2.132)	0.527
6 Months	GFR	15 (7.5%)	30 (16.7 %)	0.405 (0.210, 0.781)	0.007*

N: number of subjects in each treatment, n = number of subjects with GFR Improvement, % = $(n/N) \times 100$

CI: Confidence Interval for Odds Ratio

P-value: obtained by Fisher's Exact test

*: P-value significant (<0.05)

Case Study 1 - Nephrology

SAS Programming for Fisher Exact Test:

```
PROC FREQ DATA = FISHER ORDER = DATA;  
    BY TIME ;  
    TABLES TRT*FLAG / FISHER NOPERCENT NOCOL;  
    WEIGHT COUNT ;  
    ODS OUTPUT FishersExact = pvalue (where = (label1 ="Two-sided Pr <= P")) ;  
RUN;  
  
PROC LOGISTIC DATA =CHI ;  
    BY TIME ; CLASS TRT ;  
    WEIGHT GFR5IMP;  
    MODEL FLAG (EVENT="Y") = TRT ;  
RUN;
```

Variable explanation:

TIME : post-renal transplantation to 2 month,
 post-renal transplantation to 6 month
TRT : Treatment group: TPHUSE001, TPHUSE002
FLAG : Improvement : Y, N
COUNT : No. of subjects showing improvement

Q2: What statistical technique could be used for subject and graft survival from post renal transplantation to 2 months and 6 months?

Q3: What statistical technique could be used for Severity of first BCAR?

✱ Assumptions:

- ❖ The sample must be randomly selected from the population.
- ❖ The sample size, n , must be large enough so that the expected count in each cell is greater than or equal to 5.

Case Study 1 - Nephrology

Severity of First BCAR

Time Interval	Parameters	TPHUSE001	TPHUSE002	P-value
Post randomization to 1 month	T Cell Mild	2 (100 %)	0 (0.0%)	
	T Cell Moderate	0 (0.0%)	0 (0.0%)	
	T Cell Severe	0 (0.0%)	0 (0.0%)	
	Antibody Mediated	0 (0.0%)	0 (0.0%)	
Post randomization to 2 month	T Cell Mild	7 (77.8 %)	0 (0.0%)	0.1074
	T Cell Moderate	0 (0.0%)	0 (0.0%)	
	T Cell Severe	0 (0.0%)	0 (0.0%)	
	Antibody Mediated	2 (22.2 %)	1 (100 %)	
Post randomization to 4 month	T Cell Mild	10 (76.9 %)	2 (50.0 %)	0.3363
	T Cell Moderate	1 (7.7 %)	0 (0.0%)	
	T Cell Severe	0 (0.0%)	0 (0.0%)	
	Antibody Mediated	2 (15.4 %)	2 (50.0 %)	
Post randomization to 6 month	T Cell Mild	10 (71.4 %)	2 (50.0 %)	0.4931
	T Cell Moderate	1 (7.1 %)	0 (0.0%)	
	T Cell Severe	0 (0.0%)	0 (0.0%)	
	Antibody Mediated	3 (21.4 %)	2 (50.0 %)	

P-value: obtained by Chi-square test for association

SAS Programming for Chi-Square Test:

```
PROC FREQ DATA = BCAR;  
    BY INTERVAL;  
    TABLES TRT*SEVERITY / CHISQ;  
    WEIGHT COUNT ;  
    Output out =pvalue  CHISQ;  
RUN;
```

Variable explanation:

INTERVAL :post-renal transplantation to 1 month,
 post-renal transplantation to 2 month,
 post-renal transplantation to 4 month,
 post-renal transplantation to 6 month
TRT :Treatment group: TPHUSE001, TPHUSE002
SEVERITY :T Cell: Mild, Moderate, Severe and Antibody Mediated
COUNT :No. of subjects having corresponding BCAR

Q4: What statistical technique and test could be used to compare Adverse Event?

Table1: Summary of Treatment Emergent Adverse Events by Preferred Term

Preferred Term	TPHUSE001 (N=214) n (%)	TPHUSE002 (N=223) n (%)	Relative Risk (95% CI)	P-value
Anorexia	10 (4.67)	15 (6.73)	0.695 (0.319 , 1.512)	0.3555
Arthralgia	63 (29.44)	30 (13.45)	2.188 (1.478 , 3.239)	<0.0001*
Diarrhea	58 (27.10)	20 (8.97)	3.022 (1.884 , 4.847)	<0.0001*
Dizziness	81 (37.85)	67 (30.04)	1.260 (0.968 , 1.640)	0.0848
Dyspepsia	43 (20.09)	57 (25.56)	0.786 (0.555 , 1.114)	0.1738
Fatigue	39 (18.22)	62 (27.80)	0.655 (0.460 , 0.934)	0.0176*
Headache	52 (24.30)	45 (20.18)	1.204 (0.847 , 1.713)	0.3002
Hematuria	73 (34.11)	61 (27.35)	1.247 (0.939 , 1.656)	0.1256
Nausea	59 (27.57)	47 (21.08)	1.308 (0.937 , 1.827)	0.1134
Pain	62 (28.97)	56 (25.11)	1.154 (0.847 , 1.571)	0.3636
Pruritus	21 (9.81)	10 (4.48)	2.188 (1.055 , 4.538)	0.0301*
Rash	39 (18.22)	44 (19.73)	0.924 (0.627 , 1.362)	0.6881

N: number of subjects in each treatment, n = number of subjects with AEs, % = (n/N)*100

CI: Confidence Interval for Relative risk

P-value: obtained by Chi-square test for association

* : P-value significant (<0.05)

SAS Programming for Chi-Square Test:

```
PROC FREQ DATA = SET1 ORDER = DATA;  
  BY AEDECOD;  
  TABLES ARM*FLAG / RELRISK NOPERCENT NOCOL;  
  WEIGHT RESPONSE;  
  ODS OUTPUT RELATIVERISKS= STATS11  
  (WHERE = (STUDYTYPE ="COHORT (COL1 RISK)")) ;  
RUN;
```

Variable explanation:

AMDECOD: AE Decoded Term

ARM : Treatment group: TPHUSE001, TPHUSE002

FLAG : Yes or No

RESPONSE: No. of Subjects showing AE

Case Study 1 - Nephrology

Summary of Treatment Emergent Adverse Events by Preferred Term

SOC Term Preferred Term	TPHUSE001 (N=24) n (%)	TPHUSE002 (N=30) n (%)	P-value
EYE DISORDERS	11 (45.83 %)	26 (86.67 %)	0.003*
ABNORMAL SENSATION IN EYE	11 (45.83 %)	26 (86.67 %)	0.003*
NERVOUS SYSTEM DISORDERS	20 (83.33 %)	17 (56.67 %)	0.044*
DIZZINESS	15 (62.50 %)	12 (40.00 %)	0.170
HEADACHE	20 (83.33 %)	17 (56.67 %)	0.044*
PSYCHIATRIC DISORDERS	14 (58.33 %)	12 (40.00 %)	0.273
DEPRESSED MOOD	4 (16.67 %)	3 (10.00 %)	0.687
INSOMNIA	13 (54.17 %)	12 (40.00 %)	0.411
RESPIRATORY, THORACIC AND MEDIASTINAL DISORDERS	3 (12.50 %)	21 (70.00 %)	<0.001*
EPISTAXIS	3 (12.50 %)	21 (70.00 %)	<0.001*

N: number of subjects in each treatment, n = number of subjects with AEs, % = (n/N)*100

P-value: obtained by Fisher's Exact Test

*: P-value significant (<0.05)

Q5: How we can summarize Lab and Vital data?

Number (%) of Subjects with Vital Signs of Potential Clinical Importance / No. Tested

Visit	Parameters	TPHUSE001	TPHUSE002
Screening	Systolic Blood Pressure(mmHg)	3/120 (2.5)	2/130 (1.5)
	Low: <=90 mm Hg	2/120 (1.7)	1/130 (0.8)
	High: >=180 mm Hg	1/120 (0.8)	1/130 (0.8)
	Diastolic Blood Pressure(mmHg)	1/120 (0.8)	5/130 (3.8)
	Low: <=50 mm Hg	1/120 (0.8)	3/130 (2.3)
	High: >=110 mm Hg	0/120 (0.0)	2/130 (1.5)
	Pulse Rate (beats/min)	1/110 (0.9)	0/125 (0.0)
	Low: <=50 beats/min	0/110 (0.0)	0/125 (0.0)
	High: >=120 beats/min	1/110 (0.9)	0/125 (0.0)
Month 2 Post Transplantation	Systolic Blood Pressure(mmHg)	6/108 (5.6)	5/120 (4.1)
	Low: <=90 mm Hg	3/108 (2.8)	2/120 (1.7)
	High: >=180 mm Hg	3/108 (2.8)	3/120 (2.5)
	Diastolic Blood Pressure(mmHg)	4/108 (3.7)	3/120 (2.5)
	Low: <=50 mm Hg	3/108 (2.8)	2/120 (1.7)
	High: >=110 mm Hg	1/108 (0.9)	1/120 (0.8)
	Pulse Rate (beats/min)	4/102 (3.9)	4/118 (3.4)
	Low: <=50 beats/min	2/102 (1.9)	3/118 (2.5)
	High: >=120 beats/min	2/102 (1.9)	1/118 (0.8)

Case Study 2 - Oncology

Title	Open label, multicenter, Phase II study
Primary Object	To determine the efficacy of TPhUSE001 in subjects with hormone-refractory prostate cancer (HRPC), as measured by the objective response rate (ORR), which is a combination of CR (PSA ≤ 0.1 ng/mL) and PR ($\geq 50\%$ reduction in PSA from baseline).
Secondary Objective(s)	❖ To evaluate progression free survival and response duration . ❖ To evaluate objective tumor response (RECIST criteria).

Q1: What statistical technique could be used for primary endpoint?

✂ Prostrate Specific Antigen (PSA):

- ❖ Complete Response (PSA ≤ 0.1 ng/mL) and
- ❖ Partial Response ($\geq 50\%$ reduction in PSA from baseline)

✱ Assumptions:

- ❖ Outcome should be dichotomous.
- ❖ Observations should be independent from each other.
- ❖ If n_1 and n_2 are dichotomous response then $n_1 \cdot (n_1 + n_2) > 10$ and $n_2 \cdot (n_1 + n_2) > 10$.

Objective Response Rate for PSA			
Type of Remission	TPHUSE001 (N=41)	95% CI	P-value
Objective Response Rate (%)	7 (17.07%)	(7.152, 32.06)	<0.001*
Complete Response (CR) (%)	0 (0.00%)		
Partial Response (PR) (%)	7 (17.07%)		
Objective Progression (OP) (%)	13 (31.71%)		
Stable Disease (SD) (%)	21 (51.22%)		
Indetermination	0 (0.00%)		

N: number of subjects treatment, n: number of subjects with response, Percent = $(n/N) \cdot 100$

P-value: obtained by Binomial Exact Test

*: P-value significant (<0.05)

```
proc freq data = cl1 order =data ;  
    tables orr / binomial (p=.5);  
    exact binomial;  
    ods output  
    BinomialProp=pvalue(where=(name1in("XL_BIN","XU_BIN")));  
Run;
```

Variable explanation:

ORR : Yes or No

Q2: What statistical technique and test could be used to analyze objective tumor response (RECIST criteria) ?

Case Study 3 - Binary Logistic Regression

The primary efficacy endpoint using a logistic regression model to test the treatment effect adjusted for possible confounders (e.g. region, donor source).

SAS Programming:

```
PROC LOGISTIC DATA =PHUSE ORDER = DATA;  
  CLASS ARMCD REGION DONORS/PARAM=GLM;  
  MODEL GFR5IMP = ARMCD REGION DONORS;  
  ODS OUTPUT ODDSRATIOS=OR TYPE3=PVALUE  
  PARAMETERESTIMATES=EST01;  
RUN;
```

	Parameter Estimates	Standard Error	Odds Ratio 95% CI	P-Value
Treatment (TPhUSE001 vs. TPhUSE002)	-0.103	0.586	0.903 (0.286, 2.848)	0.8612
Region (IND vs. USA)	0.419	0.586	1.520 (0.482, 4.797)	0.4754
Donor Source (Alive vs. Deceased)	0.206	0.612	1.229 (0.370, 4.081)	0.7366

Case 4 - Multi-Nominal Logistic Regression

A clinical trial investigated a treatment for rheumatoid arthritis. Male and female patients were given either the active treatment or a placebo; the outcome measured was whether they showed marked, some, or no improvement at the end of the clinical trial.

SAS Programming:

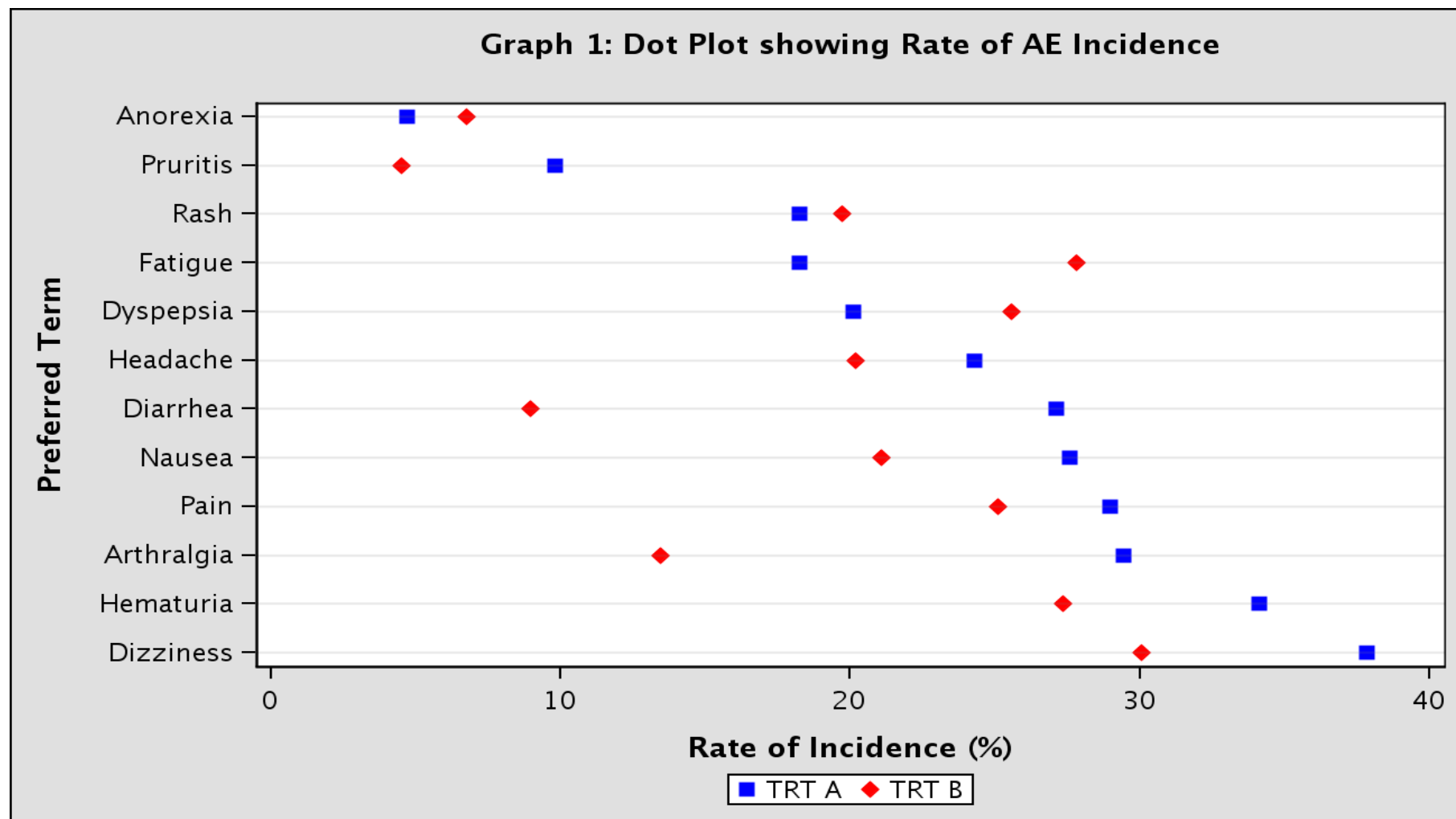
```
PROC GENMOD DATA = ARTHRITIS;  
  FREQ COUNT;  
  CLASS TREATMENT SEX;  
  MODEL IMPROVE = TREATMENT SEX / DIST = MULTINOMIAL  
  LINK = CUMLOGIT AGGREGATE = TREATMENT;  
  ODS OUTPUT PARAMETERESTIMATES = ESTIMATE;  
RUN;
```

Case 4 - Multi-Nominal Logistic Regression

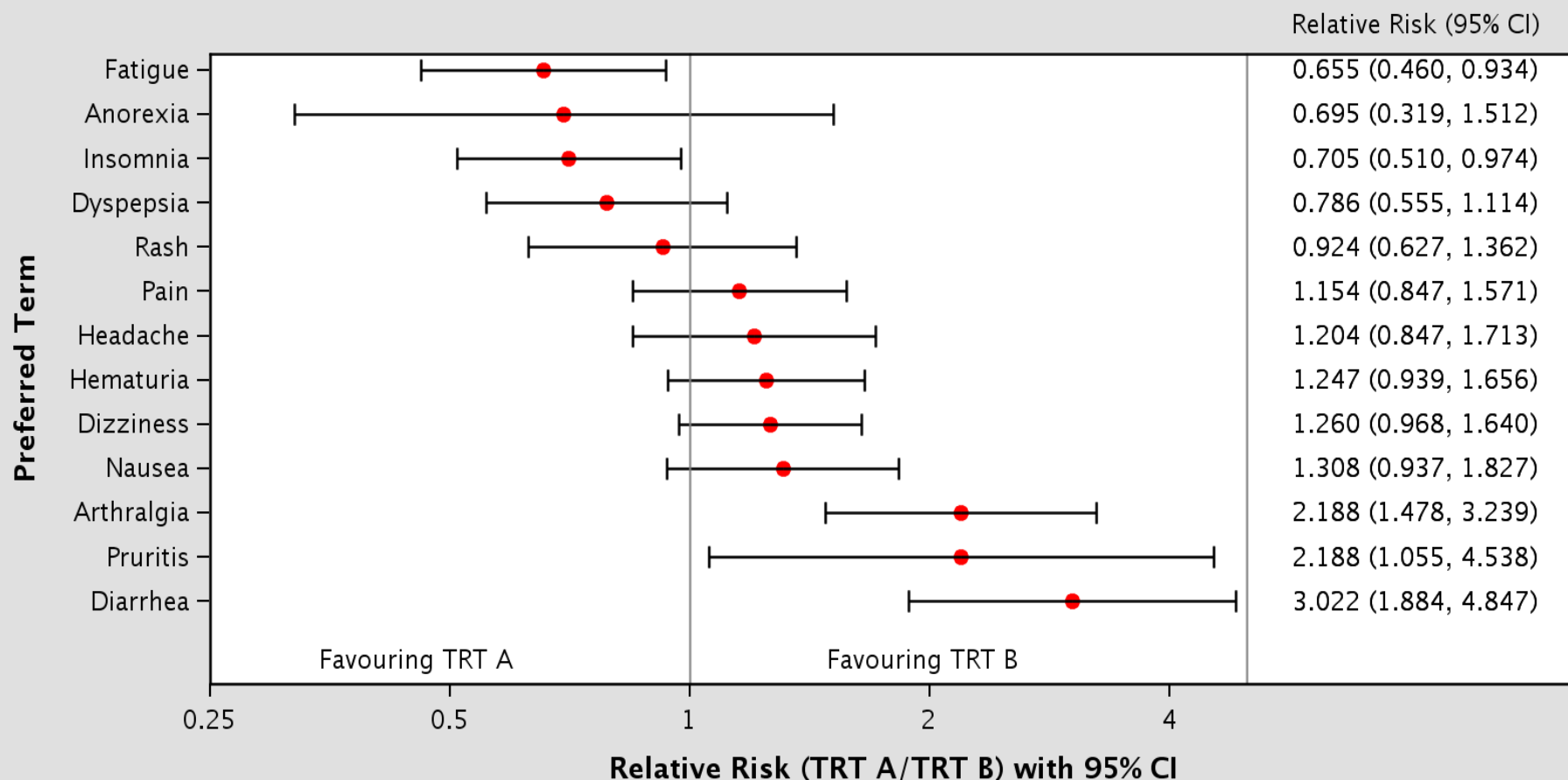
Parameter	Level 1	DF	Estimate	Stderr	95% Lower Wald CL	95% Upper Wald CL	Wald Chi-Square	P Value
Intercept1		1	-1.3654	0.4612	-2.2693	-0.4614	8.76	0.0031
Intercept2		1	1.0821	0.4524	0.1955	1.9687	5.72	0.0168
Treatment	Active	1	1.0994	0.4386	0.2398	1.9590	6.28	0.0122
Treatment	Placebo	0	0.0000	0.0000	0.0000	0.0000	.	.
Sex	Female	1	0.1999	0.4490	-0.6801	1.0798	0.20	0.6562
Sex	Male	0	0.0000	0.0000	0.0000	0.0000	.	.
Scale		0	1.0000	0.0000	1.0000	1.0000	—	—

Graphical Methods

Graphical Methods - Dot Plot

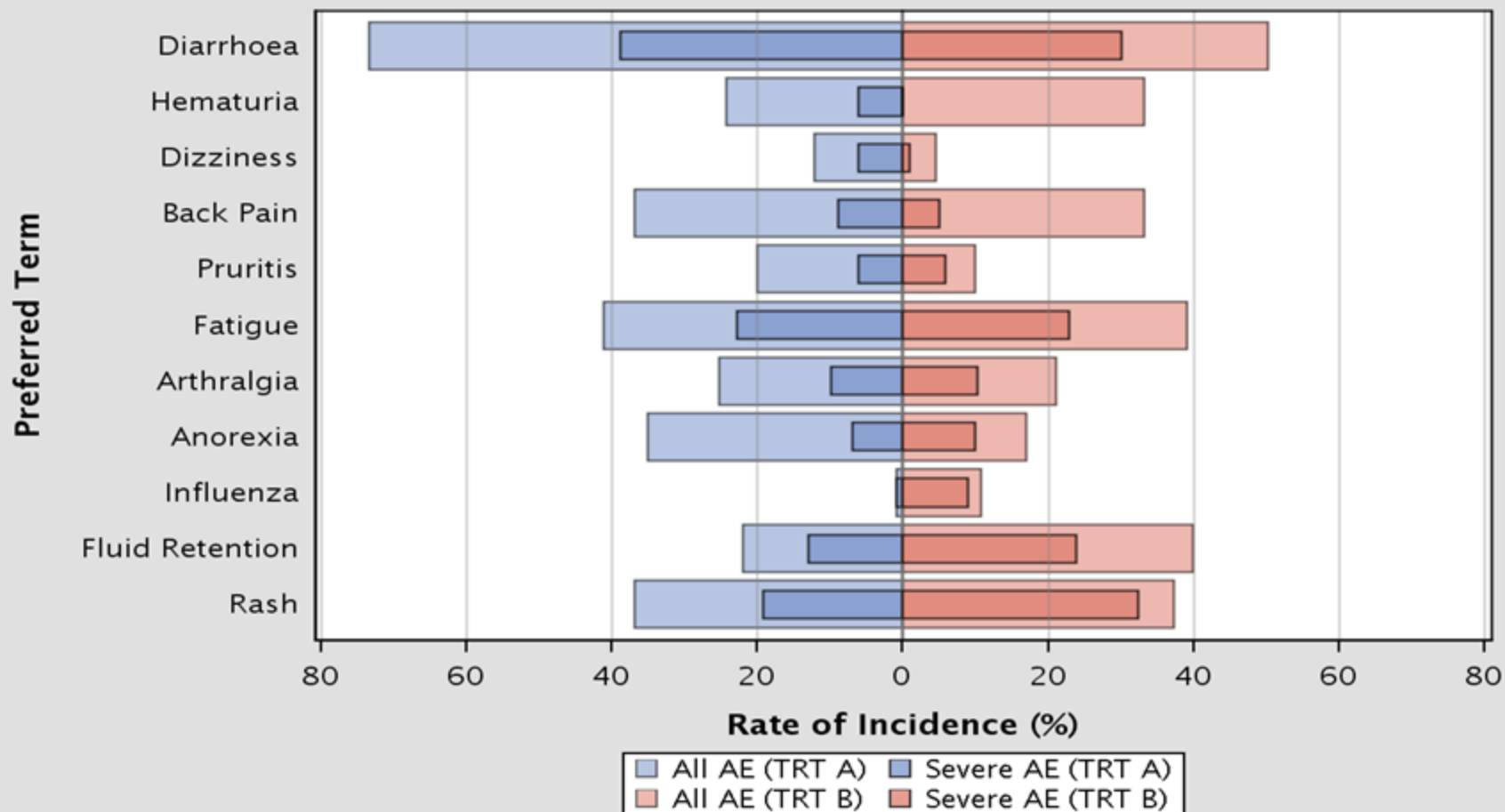


Graph 2: Forest Plot showing Relative Risk in Incidence of Adverse Event



Graphical Methods - Butterfly Plot

Graph 3: Butterfly Plot for comparing Rate of Severe Adverse Events



Thank You



Thank You