

Description of the fungicide treatments used in the strawberry leaf blight experiments over 5 years

| Year | Treatment | Rate (/acre)^a | Timing^b |
|-------------|---|---------------------------------|--|
| 1996 | 1. Captec 4L | 3 qt | Every 10-14 days starting after renovation |
| | 2. Thiram 65W | 5 lb | |
| | 3. Syllit 65W | 2 lb | |
| | 4. Benlate 50W | 16 oz | |
| | 5. Benlate 50W + Captec 4L | 8 oz + 3 qt | |
| | 6. Benlate 50W + Thiram 65W | 8 oz + 5 lb | |
| | 7. Nova 40W | 5 oz | |
| | 8. Nova 40W + Captec 4L | 5 oz + 3 qt | |
| | 9. Nova 40W + Thiram 65W | 5 oz + 5 lb | |
| | 10. Bravo 720 | 3 pt | |
| | 11. Calcium cholride | 4.5 lb | |
| | 12. Untreated control | B | B |
| 1997 | 1. Captec 4L | 3 qt | 5, 15, 26 May; 9 June |
| | 2. Thiram 65W | 5 lb | |
| | 3. Benlate 50W | 16 oz | |
| | 4. Syllit 65W | 2 lb | |
| | 5. Benlate 50W + Captec 4L | 8 oz + 3 qt | |
| | 6. Benlate 50W + Thiram 65W | 8 oz + 5 lb | |
| | 7. Nova 40W | 5 oz | |
| | 8. Untreated control | B | B |
| 1998 | 1. Benlate 50W + Thiram 65W | 8 oz + 5 lb | 4, 14, 22 May; 6 June |
| | 2. Captec 4L | 3 qt | |
| | 3. Syllit 65W | 2 lb | |
| | 4. Benlate 50W + Captec 4L | 8 oz + 3 qt | |
| | 5. Abound 2.08F | 11 oz | |
| | 6. Benlate 50W | 16 oz | |
| | 7. Nova 40W | 5 oz | |
| | 8. Thiram 65W | 5 lb | |
| | 9. Untreated control | B | |
| 1999 | 1. Captec 4L | 3 qt | 14, 21, 28 May; 4, 11 June |
| | 2. Captec 4L + Benlate 50W | 2 qt + 1 lb | |
| | 3. Thiram 65W + Benlate 50W | 4 lb + 1 lb | |
| | 4. Switch 62.5WG | 14 oz | |
| | 5. Flint 50WG/Switch 62.5 WG ^c | 3 oz / 14 oz | |

| | | | |
|------|--|------------------------|--|
| | 6. Elevate 50 WDG | 1.5 lb | |
| | 7. Abound 2.08F | 11 fl oz | |
| | 8. Rovral 50 WP | 1.5 lb | |
| | 9. Thiram 65 WP | 5 lb | |
| | 10. Untreated control | B | B |
| 2000 | 1. Switch 62.5 WG | 11 oz | 12, 19, 26,30 May; 7, 20 June |
| | 2. Switch 62.5 WG / Elevate 50WG | 11 oz 1.5 lb | 12, 19 May 26, 30 May; 7,20 June |
| | 3. Flint 50WG / Switch 62.5 WG | 3 oz 11 oz | 12, 19 May 26, 30 May; 7, 20 June |
| | 4. Switch 62.5 WG / Flint 50 WG / Switch 62.5 WG | 11 oz 3 oz 11 oz | 12, 19 May 26 May 30 May; 7, 20 June |
| | 5. Elevate 50 WG | 1.5 lb | |
| | 6. Captec 4L | 3 qt | |
| | 7. Captec 4L + Benlate 50W | 3 qt + 1 lb | |
| | 8. Abound 2.08F | 11 fl oz | |
| | 9. Nova 40W | 4 oz | |
| | 10. Untreated control | B | B |

^aRates are given in English units because this is how the labels are written.

^bIf description is blank, application timing is the same as treatment #1 in the given year.

^cFungicides were alternated.

Input SAS program to perform the generalized linear mixed model analysis.

```
/* Example of analysis of Phomopsis leaf blight for 1997 */
/* using %GLIMMIX. */
/* trt: treatment; rep: block; su: sampling unit within plot; */
/* x: number of diseased leaflets; n: leaflet number */
/* Read in data... Data strung across lines */

data phomop;
input trt rep su x n @@;
datalines;
8 1 1 4 15 8 1 2 12 15 8 1 3 11 15 8 1 4 12 15
8 1 5 9 15 1 2 1 9 15 1 2 2 4 15 1 2 3 3 15
1 2 4 9 15 1 2 5 7 15 2 3 1 3 15 2 3 2 9 15
2 3 3 4 15 2 3 4 4 15 2 3 5 6 15 7 4 1 4 15
7 4 2 0 15 7 4 3 1 15 7 4 4 2 15 7 4 5 0 15
6 1 1 2 15 6 1 2 2 15 6 1 3 1 15 6 1 4 0 15
6 1 5 6 15 3 2 1 1 15 3 2 2 1 15 3 2 3 1 15
3 2 4 0 15 3 2 5 2 15 5 3 1 0 15 5 3 2 1 15
5 3 3 1 15 5 3 4 0 15 5 3 5 0 15 8 4 1 6 15
8 4 2 1 15 8 4 3 9 15 8 4 4 4 15 8 4 5 8 15
4 1 1 5 15 4 1 2 7 15 4 1 3 5 15 4 1 4 0 15
4 1 5 5 15 5 2 1 0 15 5 2 2 0 15 5 2 3 0 15
5 2 4 1 15 5 2 5 0 15 8 3 1 12 15 8 3 2 5 15
8 3 3 6 15 8 3 4 9 15 8 3 5 5 15 1 4 1 6 15
1 4 2 11 15 1 4 3 1 15 1 4 4 2 15 1 4 5 6 15
1 1 1 0 15 1 1 2 7 15 1 1 3 0 15 1 1 4 2 15
1 1 5 4 15 8 2 1 9 15 8 2 2 7 15 8 2 3 6 15
8 2 4 0 15 8 2 5 4 15 6 3 1 1 15 6 3 2 0 15
6 3 3 0 15 6 3 4 0 15 6 3 5 1 15 4 4 1 1 15
4 4 2 0 15 4 4 3 0 15 4 4 4 0 15 4 4 5 0 15
3 1 1 4 15 3 1 2 4 15 3 1 3 0 15 3 1 4 6 15
3 1 5 5 15 4 2 1 5 15 4 2 2 3 15 4 2 3 3 15
4 2 4 3 15 4 2 5 0 15 3 3 1 3 15 3 3 2 0 15
3 3 3 0 15 3 3 4 3 15 3 3 5 8 15 6 4 1 0 15
6 4 2 0 15 6 4 3 2 15 6 4 4 1 15 6 4 5 2 15
2 1 1 0 15 2 1 2 5 15 2 1 3 1 15 2 1 4 0 15
2 1 5 6 15 2 2 1 6 15 2 2 2 2 15 2 2 3 0 15
2 2 4 6 15 2 2 5 7 15 7 3 1 0 15 7 3 2 0 15
7 3 3 0 15 7 3 4 0 15 7 3 5 0 15 5 4 1 0 15
5 4 2 1 15 5 4 3 2 15 5 4 4 0 15 5 4 5 1 15
5 1 1 0 15 5 1 2 1 15 5 1 3 1 15 5 1 4 1 15
5 1 5 0 15 6 2 1 0 15 6 2 2 3 15 6 2 3 2 15
6 2 4 1 15 6 2 5 1 15 4 3 1 1 15 4 3 2 6 15
4 3 3 0 15 4 3 4 0 15 4 3 5 1 15 3 4 1 0 15
3 4 2 0 15 3 4 3 2 15 3 4 4 3 15 3 4 5 1 15
7 1 1 0 15 7 1 2 0 15 7 1 3 0 15 7 1 4 0 15
7 1 5 0 15 7 2 1 1 15 7 2 2 1 15 7 2 3 0 15
7 2 4 0 15 7 2 5 0 15 1 3 1 3 15 1 3 2 5 15
1 3 3 7 15 1 3 4 2 15 1 3 5 1 15 2 4 1 1 15
2 4 2 0 15 2 4 3 8 15 2 4 4 5 15 2 4 5 11 15
;
/* The following statement tells SAS where to find %glimmix */
/* (you may have it in a different directory) */
/* Note: the macro may have several examples attached. */
/* Remove these examples and re-save the macro. */

%include 'c:\Program Files\Sas Institute\SAS\V8\stat\sasmacro\glimmix.sas';

/* Model A */
/* See Piepho (1999) for a nice description of the SAS input. */
/* In addition to the REPL analysis, least squares means */
/* (estimated linear predictors) for TRT are calculated, as well */
```

```

/* as pairwise differences (PDIFF) */
/* Note: COVTEST does a large-sample test for all estimated */
/* variance terms (probably not valid with typical sample sizes) */
/* Fixed effects are given on the MODEL statement; random effects */
/* are given on the RANDOM statements, and residual effects are */
/* are given with the REPEATED statement (the latter only when */
/* non-default options are needed (see Model C)). */
/* There are several ways of specifying the random terms; here the */
/* experimental error is given with the trt*rep subject (sub=) */
/* designation; >int= is intercept. */

%glimmix(data =phomop, procopt=covtest,
          stmts=%str(title 'MODEL A, 1997';
                    class trt rep su ;
                    model x/n = trt / solution chisq;
                    random rep;
                    random int / sub=trt*rep;
                    lsmeans trt / cl pdiff;
                    ),
          error=binomial, maxit=50,
          link=logit
);

/* Model B */
/* Need to specify initial estimates of variances in PARMs for: */
/* rep, rep*trt, sampling error, and residual (phi). */
/* Four variances in total. The fourth one is equated to 1 here */
/* (with the EQCONS option) */

%glimmix(data =phomop, procopt=covtest,
          stmts=%str(title 'MODEL B, 1997';
                    class trt rep su ;
                    model x/n = trt / solution chisq;
                    random rep;
                    random int su/ sub=trt*rep;
                    parms (0.04) (0.03) (0.4) (1) /eqcons=4;
                    lsmeans trt / cl pdiff;
                    ),
          error=binomial, maxit=50,
          link=logit
);

/* Model C */
/* The REPEATED statement is used to define the residual */
/* variance (not needed in A, because in A one is using the */
/* default of a single phi). */
/* Only needed when there are special conditions. */

%glimmix(data =phomop, procopt=covtest,
          stmts=%str(title 'MODEL C, 1997';
                    class trt rep su ;
                    model x/n = trt / solution chisq;
                    random rep;
                    random int / sub=trt*rep;
                    repeated su / sub=rep group=trt;
                    lsmeans trt / cl pdiff;
                    ),
          error=binomial, maxit=50,
          link=logit
);

/* Next run is just to get predicted p_i's without random effects; */
/* use as first step in 2-step estimation of local phi (residual). */
/* Otherwise, ignore output */

```

```

/* Data file is created (>results=) to be used in the next step      */
                                                                    */

%glimmix(data =phomop, procopt=covtest,
          stmts=%str(title 'first step to get p_hats for later analysis';
                    class trt rep su ;
                    model x/n = trt / solution chisq;
                    ),
          error=binomial,
          link=logit,
          out=results
);

/* Create needed variable (PQT) from above output                    */
/* to use as input for Model D, below                                */
/* (in convention of glimmix, mu is p_hat, and _wght is n)          */
                                                                    */

data phomop2;
  set results;
  pqt=log(mu*(1-mu)/_wght);

/* Model D                                                            */
/* Use original data and the predicted mu's (p_hats) from           */
/* a fixed-effects-only model.                                       */
/* See the REPEATED with LOCAL option for the                       */
/* binary power-law.                                                 */
/* Note: overdispersion scale (phi) is A of the binary power-law.   */
/* Thus, this calculated scale has no physical meaning at all       */
/* (because b' and p_hat must be considered).                       */
                                                                    */

%glimmix(data =phomop2, procopt=covtest,
          stmts=%str(title 'MODEL D, 1997 (uses REPEATED/LOCAL option)';
                    class trt rep su ;
                    model x/n = trt / solution chisq;
                    random rep;
                    random int / sub=trt*rep;
                    repeated / local = exp(pqt);
                    lsmeans trt / cl pdiff;
                    ),
          error=binomial,
          link=logit, maxit=50
);

/* Model E                                                            */
/* One must change the PARMs statement to match the                 */
/* number of variance terms. One needs (in this order):            */
/* an initial estimate for rep, rep*trt, variance for each         */
/* treatment level, and then the residual phi (=1).                 */
/* With 1997, there are 8 treatment levels, so one specifies       */
/* 1+1+8+1 = 11 variance estimates.                                  */
/* One also must indicate that the last term is always 1.         */
                                                                    */

%glimmix(data =phomop, procopt=covtest,
          stmts=%str(title 'MODEL E, 1997';
                    class trt rep su ;
                    model x/n = trt / solution chisq;
                    random rep;
                    random int / sub=trt*rep;
                    random su / sub=rep group=trt;
                    parms (0.01) (0.6) (.1) (.1) (.1) (.1) (.1)
                          (.1) (.1) (.1) (1) /eqcons=11;
                    lsmeans trt / cl pdiff;
                    ),

```

```
    error=binomial, maxit=50,  
    link=logit  
);  
run;
```

Example of truncated and annotated output of the %GLIMMIX procedure for Model A with the 1997 data set^a

MODEL A, 1997

The Mixed Procedure

Model Information
Class Level Information

| Class | Levels | Values |
|-------|--------|-----------------|
| trt | 8 | 1 2 3 4 5 6 7 8 |
| rep | 4 | 1 2 3 4 |
| su | 5 | 1 2 3 4 5 |

Below are the estimates of the variance (or >covariance= parameters). For this Model, there is a variance for rep (or block), experimental error (= Intercept with subject=trt*rep), and residual (phi; overdispersion term). For other models, this section of output would list the additional estimated variance terms (e.g., sampling variance [Model B]; b= of binary power law [Model D])^a.

Note: for this data set, block variance estimate (called rep here) is 0. The standard error of the estimated variance term is based on large-sample-theory for linear mixed models. The Z value is the estimate divided by the standard error. For small data sets, and for GLMMs, it is unlikely that the estimated variance terms have a normal distribution. Use the Z value to be a very rough guide about the distance of the estimate from 0.

Convergence criteria met.

Covariance Parameter Estimates

| Cov Parm | Subject | Estimate | Standard Error | Z Value | Pr Z |
|-----------|---------|----------|----------------|---------|--------|
| rep | | 0 | . | . | . |
| Intercept | trt*rep | 0.2195 | 0.1436 | 1.53 | 0.0633 |
| Residual | | 2.2021 | 0.2739 | 8.04 | <.0001 |

The following Fit Statistics are only directly useful for a linear mixed model (not a GLMM).

The log likelihood is not for the (overdispersed) binomial, but for a normal distribution at the last call of MIXED. The actual quasi-likelihood for overdispersed proportion data is incorporated into the Deviance (later).

Fit Statistics

| | |
|--------------------------|-------|
| -2 Res Log Likelihood | 529.3 |
| AIC (smaller is better) | 533.3 |
| AICC (smaller is better) | 533.4 |
| BIC (smaller is better) | 532.1 |

The following results are the estimated parameters for treatment (tau) effects. There is an intercept (mean), and coefficients for each treatment level (see eq. 1 in paper). The linear predictors are derived from these values. For example, the estimated linear predictor for treatment 2 (conditional on the expected values of the random effects) is: $-0.1491 + (-0.8069) = -0.9560$.

Solution for Fixed Effects

| Effect | trt | Estimate | Standard Error | DF | t Value | Pr > t |
|-----------|-----|----------|----------------|----|---------|---------|
| Intercept | | -0.1491 | 0.2917 | 3 | -0.51 | 0.6444 |
| trt | 1 | -0.7306 | 0.4195 | 21 | -1.74 | 0.0962 |
| trt | 2 | -0.8069 | 0.4206 | 21 | -1.92 | 0.0688 |
| trt | 3 | -1.6431 | 0.4478 | 21 | -3.67 | 0.0014 |
| trt | 4 | -1.6408 | 0.4482 | 21 | -3.66 | 0.0015 |
| trt | 5 | -3.2219 | 0.6067 | 21 | -5.31 | <.0001 |
| trt | 6 | -2.2667 | 0.4872 | 21 | -4.65 | 0.0001 |
| trt | 7 | -3.3533 | 0.6285 | 21 | -5.34 | <.0001 |
| trt | 8 | 0 | . | . | . | . |

The following are the tests for treatment effect (see SAS for a description of >Type 3' nomenclature). Although both chi-square and F-tests can be performed, we use only the F-test.

Type 3 Tests of Fixed Effects

| Effect | Num DF | Den DF | Chi-Square | F Value | Pr > ChiSq | Pr > F |
|--------|--------|--------|------------|---------|------------|--------|
| trt | 7 | 21 | 60.86 | 8.69 | <.0001 | <.0001 |

The least squares means are the estimated linear predictors for each treatment level (at the expected values of the random effects). Also printed (among other things): estimated standard errors of the least square means, degrees of freedom $= (8-1)*(4-1)$, t-statistic for least squares means, and 95% confidence intervals. An estimate of p for the 1st treatment can be calculated as $1/(1+\exp(-(-0.8798))) = 0.293$. The standard error of this estimate of p requires a more complicated calculation (see Littell et al. [23]).

Least Squares Means

| Effect | trt | Estimate | Standard Error | DF | t Value | Pr > t | Alpha | Lower | Upper |
|--------|-----|----------|----------------|----|---------|---------|-------|---------|---------|
| trt | 1 | -0.8798 | 0.3016 | 21 | -2.92 | 0.0082 | 0.05 | -1.5069 | -0.2526 |
| trt | 2 | -0.9560 | 0.3031 | 21 | -3.15 | 0.0048 | 0.05 | -1.5863 | -0.3257 |
| trt | 3 | -1.7923 | 0.3398 | 21 | -5.28 | <.0001 | 0.05 | -2.4989 | -1.0857 |
| trt | 4 | -1.7900 | 0.3403 | 21 | -5.26 | <.0001 | 0.05 | -2.4976 | -1.0824 |
| trt | 5 | -3.3711 | 0.5320 | 21 | -6.34 | <.0001 | 0.05 | -4.4774 | -2.2647 |
| trt | 6 | -2.4158 | 0.3903 | 21 | -6.19 | <.0001 | 0.05 | -3.2274 | -1.6042 |
| trt | 7 | -3.5025 | 0.5568 | 21 | -6.29 | <.0001 | 0.05 | -4.6603 | -2.3446 |
| trt | 8 | -0.1491 | 0.2917 | 21 | -0.51 | 0.6145 | 0.05 | -0.7557 | 0.4574 |

The following are pair-wise differences of estimated linear predictors (for all possible pairings of treatment levels). For example, the difference between treatments 1 and 2 is: $-0.8798 - (-0.9560) = 0.0762$, given as Estimate below. The standard error is the standard error of the difference (SED). T-value is the results of a t-test for the difference. Note: the difference of estimated $p=s$ cannot be determined by transforming the difference of the estimated linear predictors; one must first estimate the $p=s$, then determine the differences. However, the differences of the estimated linear predictors are appropriate for determining significant differences between treatments.

Differences of Least Squares Means

| Effect | trt | _trt | Estimate | Standard Error | DF | t Value | Pr > t | Alpha | Lower | Upper |
|--------|-----|------|----------|----------------|----|---------|---------|-------|----------|--------|
| trt | 1 | 2 | 0.07623 | 0.4276 | 21 | 0.18 | 0.8602 | 0.05 | -0.8129 | 0.9654 |
| trt | 1 | 3 | 0.9125 | 0.4543 | 21 | 2.01 | 0.0576 | 0.05 | -0.03223 | 1.8573 |
| trt | 1 | 4 | 0.9102 | 0.4547 | 21 | 2.00 | 0.0584 | 0.05 | -0.03530 | 1.8557 |
| trt | 1 | 5 | 2.4913 | 0.6115 | 21 | 4.07 | 0.0005 | 0.05 | 1.2195 | 3.7630 |
| trt | 1 | 6 | 1.5360 | 0.4932 | 21 | 3.11 | 0.0052 | 0.05 | 0.5103 | 2.5617 |

| | | | | | | | | | | |
|-----|---|---|---------|--------|----|-------|--------|------|---------|--------|
| trt | 1 | 7 | 2.6227 | 0.6332 | 21 | 4.14 | 0.0005 | 0.05 | 1.3059 | 3.9395 |
| trt | 1 | 8 | -0.7306 | 0.4195 | 21 | -1.74 | 0.0962 | 0.05 | -1.6031 | 0.1419 |
| trt | 2 | 3 | 0.8363 | 0.4553 | 21 | 1.84 | 0.0804 | 0.05 | -0.1106 | 1.7831 |
| trt | 2 | 4 | 0.8340 | 0.4557 | 21 | 1.83 | 0.0815 | 0.05 | -0.1137 | 1.7816 |
| .. | | | | | | | | | | |

Results cut here for brevity (there are $8*7/2 = 28$ pairs for the 8 treatment).

..

GLMM statistics. Deviance is based on the quasi-likelihood (conditional on the random effects). Extra-Dispersion Scale is the same as the overdispersion or Residual variance ($\hat{\sigma}$; see above). Scaled Deviance is Deviance/Scale. Pearson chi-square is another type of goodness of fit. Dividing Deviance by the degrees of freedom gives another way of estimating extra-dispersion scale. There are 160 observations and 8 fixed-effects parameters in this data set; thus, $v = 152$. This gives $D/v = 2.35$ for another measure of overdispersion.

GLIMMIX Model Statistics

| Description | Value |
|---------------------------|----------|
| Deviance | 358.6275 |
| Scaled Deviance | 162.8542 |
| Pearson Chi-Square | 311.4997 |
| Scaled Pearson Chi-Square | 141.4533 |
| Extra-Dispersion Scale | 2.2021 |

^aAnnotations are given in Times Roman. The SAS output is in **Courier**.