Representing Optical Density
Growth Measurements to Assess
Antimicrobial Susceptibility in
Target Pathogens

R Tutorial Presentation Tatiana McGarry



Guided and Unguided Antimicrobial Peptides (AMPs)

The antibiotic resistance crisis has prompted the search for new drugs that can combat infection.

Antimicrobial peptides are protein molecules that exhibit antimicrobial properties, and which can be used to destroy pathogens.

Guided (aka targeted) antimicrobial peptides are AMPs that have been fitted with a selective guide that allows them to attach directly to the pathogen of interest and leave other microbes largely unaffected.

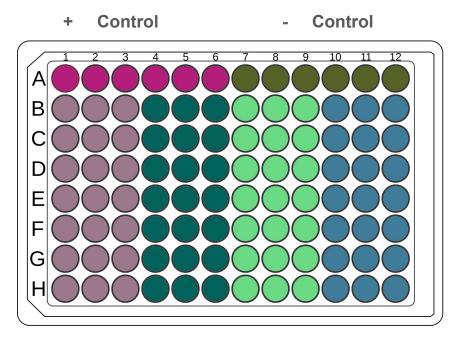
The experiment and data analysis pipeline presented here are used to assess the activity of guided and unguided AMPs against their target pathogens.

Experimental Design

96 well plate prepared with pathogen cultures in serial dilutions of targeted and untargeted AMPs – concentrations ranging from 0.5 to $32 \mu M$

Placed in optical density reader programmed to take readings every 30 minutes over the course of a few days

Optical density data for each well is collected and analysed after the experiment.



AMP1 G-AMP1 AMP2 G-AMP2

CA CB 8 AMP2-2...69 AMP2-2...7G AMP2-2...7G AMP2-2...7G AMP2-2...7G AMP2-2...7G AMP2-1...8G AMP2 $\begin{bmatrix} 8 & 0.00539586 & 0.02337831 & 0.01618759 & 0.01079173 & 0.00719448 & 0.01351449 & 0.01802912 & 0.01259035 & 0.01259035 & 0.00719448 & 0.01079173 & 0.03574775 & 0.0170869 & 0.0089931 & 0.01798621 & 0.0089931 & 0.01348966 & 0.01596903 & 0.0170869 & 0.0170$ $0.0221281 \ \ 0.00501159 \ \ 0.01785628 \ \ 0.01412979 \ \ 0.00793612 \ \ 0.01587224 \ \ 0.00992015 \ \ 0.01388821 \ \ 0.01388821 \ \ 0.00793612 \ \ 0.0190418 \ \ 0.01785628 \ \ 0.0184829 \ \ 0.00992015 \ \ 0.00992015 \ \ 0.01984031 \ \ 0.00992015 \ \ 0.01984031 \ \ 0.00992015 \ \ 0.0188023 \ \ 0.02596847 \ \ 0.01884829 \ \ 0.018848$ $0.0062509 \ \ 0.00416727 \ \ 0.03358422 \ \ 0.01250181 \ \ 0.00833454 \ \ 0.0166908 \ \ 0.02591041 \ \ 0.01458544 \ \ 0.01458544 \ \ 0.01458544 \ \ 0.01458544 \ \ 0.01250181 \ \ 0.01875271 \ \ 0.03743529 \ \ 0.01041817 \ \ 0.01504487 \ \ 0.02083634 \ \ 0.01041817 \ \ 0.01502726 \ \ 0.02083634 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0.07585818 \ \ 0.03792909 \ \ 0.07585818 \ \ 0.07206527 \ \ 0.0816093$ $0.02495181 \ \, 0.02606501 \ \, 0.07485543 \ \, 0.04990362 \ \, 0.03326908 \ \, 0.06653816 \ \, 0.04162551 \ \, 0.05822089 \ \, 0.06889001 \ \, 0.02778331 \ \, 0.05477938 \ \, 0.07901406 \ \, 0.04158635 \ \, 0.04158635 \ \, 0.04158635 \ \, 0.04158635 \ \, 0.04158635 \ \, 0.0831727 \ \, 0.04158635 \ \, 0.06237952 \ \, 0.0831727 \ \, 0.07901406 \$ $0.02611973 \mid 0.01629801 \mid 0.08813106 \mid 0.05223946 \mid 0.04575252 \mid 0.06965262 \mid 0.04353289 \mid 0.06094604 \mid 0.06094604 \mid 0.05939112 \mid 0.0783592 \mid 0.08271248 \mid 0.04487952 \mid 0.04353289 \mid 0.0893853 \mid 0.04353289 \mid 0.06529933 \mid 0.08706577 \mid 0.08259984 \mid 0.10104 \mid 0.06094694 \mid 0.060946$ 0.02733689 0.01822459 0.08201066 0.05467378 0.03644918 0.07289837 0.03961056 0.06967618 0.07284023 0.04419589 0.05467378 0.08201066 0.08656681 0.04556148 0.05561632 0.10942185 0.04556148 0.08107418 0.10414098 0.08656681 0.08656681 $0.02860484 \ \ 0.01906989 \ \ 0.08581452 \ \ 0.05720968 \ \ 0.03813979 \ \ 0.07417583 \ \ 0.04767473 \ \ 0.06674463 \ \ 0.03625932 \ \ \ 0.0524522 \ \ 0.08538083 \ \ 0.05385997 \ \ 0.04767473 \ \ 0.011119801 \ \ 0.04767473 \ \ 0.07610057 \ \ 0.09534946 \ \ 0.09058199 \ \ 0.$ 6 0.02992515 0.0199501 0.08977544 0.05985029 0.0399002 0.0798039 0.04747249 0.0745628 0.06982534 0.0399002 0.05985029 0.08977544 0.09476296 0.05798373 0.04987524 0.09537921 0.04987524 0.07481287 0.09975049 0.10244539 0.0947629 39 9 0.03129937 0.02025101 0.10212858 0.06259873 0.04931693 0.09676331 0.05216561 0.07303186 0.07303186 0.05404278 0.06259873 0.10832531 0.11022858 0.05216561 0.0632242 0.10433122 0.05216561 0.07824842 0.10433122 0.09911466 0.108273 $40 \quad 20.03272905 \quad 0.02181936 \quad 0.11571793 \quad 0.06545809 \quad 0.04363873 \quad 0.08727746 \quad 0.08727746 \quad 0.07636777 \quad 0.09546212 \quad 0.05591278 \quad 0.06545809 \quad 0.09818714 \quad 0.11287007 \quad 0.06517136 \quad 0.06481679 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Data Transformations

-	Time [‡]	name ‡	value 9.590443e-04	
1	0.0	Blank2		
2	0.0	Blank3	1.523397e-02	
3	0.0	Blank4	0.000000e+00	
4	0.0	Blank5	-1.672591e-03	
5	0.0	Blank6	1.254863e-02	
6	0.0	Blank7	1.080406e-02	
7	0.0	Positive Control8	2.723957e-02	
8	0.0	Positive Control9	1.798621e-02	
9	0.0	Positive Control10	3.218152e-02	
10	0.0	Positive Control11	1.798621e-02	
11	0.0	Positive Control12	1.798621e-02	
12	0.0	Positive Control13	1.798621e-02	
13	0.0	AMP1-3214	8.993105e-04	
14	0.0	AMP1-3215	0.000000e+00	
15	0.0	AMP1-3216	0.000000e+00	
16	0.0	G AMP1-3217	8.993105e-04	
17	0.0	G AMP1-3218	0.000000e+00	
18	0.0	G AMP1-3219	0.000000e+00	
19	0.0	AMP2-3220	-1.391547e-03	
20	0.0	AMP2-3221	8.993105e-04	
21	0.0	AMP2-3222	0.000000e+00	
22	0.0	G AMP2-3223	2.697931e-03	
23	0.0	G AMP2-3224	4.496552e-03	
24	0.0	C 414D2 22 25	0 000000 00	

mutate(...gsub ("\\.\\.\\d+", "", name)) ...

separate(...)

Data\$Type <- if_else(...)

Data\$Type <- if_else(...)

BASE_AMP=if _else(grepl(...)

as.character(m
ap(strsplit(..))

*	Time	AMP [‡]	Concentration (uM) value Type		Type	BASE_AMP
1	0.0	Blank	NA	9.590443e-04		Blank
2	0.0	Blank	NA	1.523397e-02		Blank
3	0.0	Blank	NA	0.000000e+00		Blank
4	0.0	Blank	NA	-1.672591e-03		Blank
5	0.0	Blank	NA	1.254863e-02		Blank
6	0.0	Blank	NA	1.080406e-02		Blank
7	0.0	Positive Control	NA	2.723957e-02		Positive Control
8	0.0	Positive Control	NA	1.798621e-02		Positive Control
9	0.0	Positive Control	NA	3.218152e-02		Positive Control
10	0.0	Positive Control	NA	1.798621e-02		Positive Control
11	0.0	Positive Control	NA	1.798621e-02		Positive Control
12	0.0	Positive Control	NA	1.798621e-02		Positive Control
13	0.0	AMP1	32	8.993105e-04	Unguided	AMP1
14	0.0	AMP1	32	0.000000e+00	Unguided	AMP1
15	0.0	AMP1	32	0.000000e+00	Unguided	AMP1
16	0.0	G AMP1	32	8.993105e-04	Guided	AMP1
17	0.0	G AMP1	32	0.000000e+00	Guided	AMP1
18	0.0	G AMP1	32	0.000000e+00	Guided	AMP1
19	0.0	AMP2	32	-1.391547e-03	Unguided	AMP2
20	0.0	AMP2	32	8.993105e-04	Unguided	AMP2
21	0.0	AMP2	32	0.000000e+00	Unguided	AMP2
22	0.0	G AMP2	32	2.697931e-03	Guided	AMP2
23	0.0	G AMP2	32	4.496552e-03	Guided	AMP2

Group and Calculate Statistics

Data <- Data %>% group_by(AMP, BASE_AMP, `Concentration (uM)`, Type, Time)

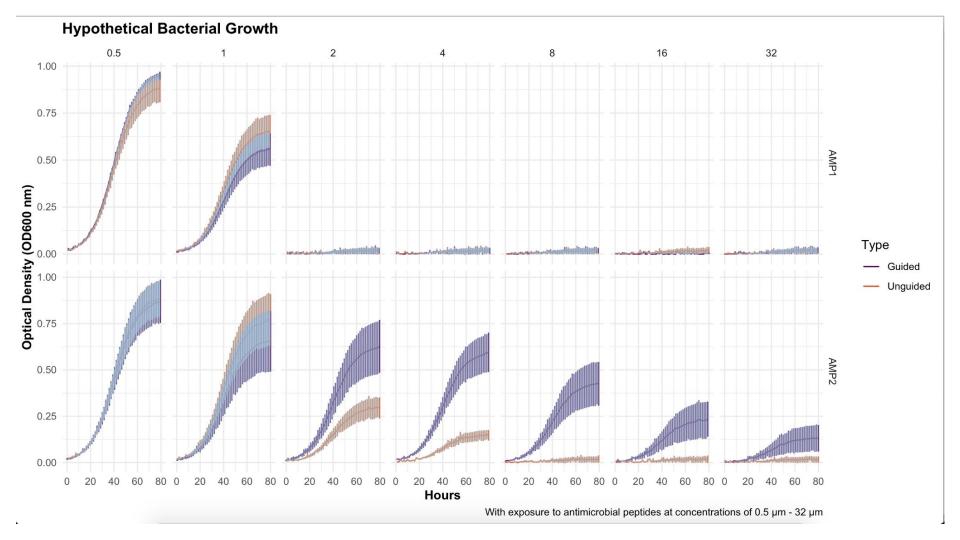
Data <- summarize(Data, Mean=mean(value), number=n(),

upper_confindence=mean(
value)+sd(value)/sqrt(n()),

lower_confindence=mean(v
alue)-sd(value)/sqrt(n()))

Data <- Data %>%
 mutate(...) =
as.numeric(`Concentration
(uM)`))

^	АМР	BASE_AMP	Concentration (uM)	Туре	Time	Mean	number	upper_confindence	lower_confindence
1	AMP1	AMP1	0.5	Unguided	0.0	0.01551520	3	0.01657813	0.0144522
2	AMP1	AMP1	0.5	Unguided	0.5	0.01600889	3	0.01710064	0.0149171
3	AMP1	AMP1	0.5	Unguided	1.0	0.01989900	3	0.02314272	0.0166552
4	AMP1	AMP1	0.5	Unguided	1.5	0.01796704	3	0.01949390	0.0164401
5	AMP1	AMP1	0.5	Unguided	2.0	0.01969314	3	0.02136435	0.0180219
6	AMP1	AMP1	0.5	Unguided	2.5	0.02606925	3	0.03014862	0.0219898
7	AMP1	AMP1	0.5	Unguided	3.0	0.02757103	3	0.03477014	0.02037193
8	AMP1	AMP1	0.5	Unguided	3.5	0.02372391	3	0.02476566	0.0226821
9	AMP1	AMP1	0.5	Unguided	4.0	0.02267532	3	0.02595462	0.0193960
10	AMP1	AMP1	0.5	Unguided	4.5	0.02513032	3	0.02726294	0.0229976
11	AMP1	AMP1	0.5	Unguided	5.0	0.02913582	3	0.03368291	0.0245887
12	AMP1	AMP1	0.5	Unguided	5.5	0.02769197	3	0.03004198	0.0253419
13	AMP1	AMP1	0.5	Unguided	6.0	0.02782032	3	0.02972110	0.0259195
14	AMP1	AMP1	0.5	Unguided	6.5	0.03833274	3	0.04189098	0.0347744
15	AMP1	AMP1	0.5	Unguided	7.0	0.04018868	3	0.04757183	0.03280553
16	AMP1	AMP1	0.5	Unguided	7.5	0.03359420	3	0.03644509	0.0307433
17	AMP1	AMP1	0.5	Unguided	8.0	0.03613834	3	0.03952655	0.03275012
18	AMP1	AMP1	0.5	Unguided	8.5	0.03698215	3	0.04012055	0.0338437
19	AMP1	AMP1	0.5	Unguided	9.0	0.03879653	3	0.04208890	0.0355041
20	AMP1	AMP1	0.5	Unguided	9.5	0.04069573	3	0.04414927	0.0372421
21	AMP1	AMP1	0.5	Unguided	10.0	0.05010877	3	0.05740026	0.04281728
22	AMP1	AMP1	0.5	Unguided	10.5	0.04466609	3	0.04728214	0.04205003
23	AMP1	AMP1	0.5	Unguided	11.0	0.04693821	3	0.05092150	0.0429549



Questions?