# Microbiology and food safety in Limfjorden mussels from 1996 to 2013 

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## Aim of the report

The aim of this analysis is to examine possible trends in results for food safety sampling in relation to microorganisms. Study focuses mainly on the distribution of $E$. Coli showing the distribution in Limfjorden over the years and season. The distribution is shown by measurement points and risk maps.

## Methods

## Work done in excel:

Data was received from Fødevarestyrelsen as excel spreadsheets that had send the data to Foreningen MuslingeErhvervet. The spreadsheets were examined for inconsistencies and requirements for simple manipulations:

- GPS coordinates were converted into decimal degrees when needed. Unneeded and repetitive columns were deleted. Only columns containing important information to map manipulations and statistical analysis were left (Zone nr, Mussel farm nr, Ship nr, date of sample taken, Species, Lab name, salmonella and $E$. Coli)
- Salmonella and E. Coli were converted to positive (1) and negative (0) values using IF function. Salmonella was considered negative when the sample wasn't analysed (it) or tested negative (ip). Sample was considered positive if marked por pv. An unknown abbreviation "s" was found and this sample was left out.
- An E. Coli the sample was considered positive if the value was over 230 . If three samples were collected in the same place, the point/sample was considered positive if one of the samples was positive.
- A combined column was made out of mussel farm numbers and indication of samples taken in fishery. To ease the statistical analysis the data was reduced to binary data using the IF function in excel. The mussel farms were given the number 1 , fishery samples were given the number 0 and if the origin was unknown the samples were given N/A.
- Extra cells were made for month and year, for keeping better track of data in Maplnfo and to check seasonal variations. After manipulations the exact date of the sample was discarded and for both statistical and map manipulations the year and month were used to look at seasonality and variations in between years.
- Some renaming was done to ensure that the statistical program $R$ would treat the data set correctly. Å was replaced with AA and $\varnothing$ with OO, also blåmuslinger was changed to blåmusling. Points that didn't have coordinates were ignored.


## Manipulations in MapInfo:

Tables were made based on the data manipulations done in excel. The projection of the tables was chosen to be longitude/latitude. Columns were specified according to the data they were holding. As shown in Figure 1. Tables included all the necessary data needed for analysing E. Coli and salmonella abundance in Limfjorden. Zone number was placed as integer to not allow any decimal places, all data that consisted of words or numbers and a letter were introduced as characters, the analysis date was set ad date, rest was introduced as float, which allows as many decimal points as needed.


Figure 1 Build-up of the tables made based on excel data.

Data from excel was copy-pasted into the newly made tables. Tables were made for each year separately based on the same model table. These base tables also included the exact date of the taken sample, exact E. Coli measurements. These tables (for each year) were combined into a main table containing all the data from all the years. Points were created to visualize the distribution of samples. To limit the study area a SQL query was made using two tables: the newly made table and the fishery area table a new table was made containing only samples from Limfjorden.

| Year | Number of <br> samples <br> taken in <br> Limfjorden | Year | Number of <br> samples <br> taken in <br> Limfjorden |  |
| :---: | :---: | :---: | :---: | :---: |
| 1996 | 60 | 2006 | 336 |  |
| 1997 | 29 | 2007 | 211 |  |
| 1998 | 2 | 2008 | 467 |  |
| 2000 | 37 | 2009 | 334 |  |
| 2001 | 40 | 2010 | 255 |  |
| 2002 | 74 | 2011 | 359 |  |
| 2003 | 85 | 2012 | 357 |  |
| 2004 | 101 | 2013 | 109 |  |
|  | 208 | Total number <br> of samples <br> taken over <br> the years | 3064 |  |
| 2005 |  |  |  |  |

Tables were made for all the separate years and one combined table containing all the years (made by appending rows from all the tables into a new table). In the separate year layers, positive E. Coli results were highlighted with red. The combined table was copied to excel to further manipulate the table. As explained before, the exact date of samples was discarded, the measurements of $E$. Coli was removed and only the binary response was left, also a new combined column called type was made. This new table was copied back to a new MapInfo table. This step was done to bring map manipulations closer to statistical analysis.

The next two tables were compared to confirm the point's locations. In 2004 the fishery numbering system was changed. Due to that some fishery zones had multiple zone numbers within them. The old and new fishery areas can be seen in Figure 2 and Figure 3.


Figure 2
Fishery zones until 2004


Figure 3
Fishery zones after 2004


Figure 4
Map of fishery zones after 2011
Point manipulations were done after comparing the fishery zones before and after the name change. When the points didn't fit either new or old numbering the year and neighbouring zones were compared and the points were moved to the correct zone, if the location was unproven the points were deleted. These can be seen in Figure 4 and Table 2.

Table 2 Deleted points or the changed zone number after comparing coordinates with mussel farm location table.

| Zone <br> $n r$ | Type | Ship <br> $n r$ | y <br> coordinate | $x$ <br> coordinate | Month | Year | Species | Lab | Salmonella | E. <br> Coli | Proven <br> location |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 19 | 1 | N/A | 56.8702 | 9.14067 | Nov | 2010 | Blåmusling | Aalborg | 0 | 1 |  |
| 35 | 0 | SK925 | 56.8727 | 8.63845 | August | 2011 | Blåmusling | Aalborg | 0 | 0 |  |
| 35 | 0 | SK925 | 56.8727 | 8.63845 | August | 2011 | Blåmusling | Aalborg | 0 | 0 |  |
| 35 | 0 | SK925 | 56.8727 | 8.63845 | August | 2011 | Blåmusling | Aalborg | 0 | 0 |  |
| 35 | 0 | T229 | 56.8727 | 8.63845 | July | 2011 | Blåmusling | Aalborg | 0 | 0 |  |
| 35 | 0 | N/A | 56.8727 | 8.63845 | July | 2011 | Blåmusling | Aalborg | 0 | 0 |  |
| 13 | 1 | N/A | 56.7683 | 8.49167 | July | 2009 | Blåmusling | Aalborg | 0 | 0 |  |
| 9 | 0 | T194 | 56.6767 | 9.155 | Aug | 2008 | Blåmusling | Aalborg | 0 | 0 |  |
| 36 | 1 | N/A | 56.6741 | 9.125 | May | 2013 | Blåmusling | Eurofins | 0 | 0 | zone 19 |
| 19 | 0 | L919 | 56.8167 | 8.93333 | Sep | 1996 | Blåmusling | Højmark | 0 | 0 |  |
| 20 | 0 | L919 | 56.8167 | 8.93333 | Sep | 1996 | Blåmusling | Højmark | 0 | 0 |  |
| 19 | 0 | L919 | 56.8 | 8.91667 | Nov | 1996 | Blåmusling | Højmark | 0 | 0 |  |
| 13 | 0 | L919 | 56.8167 | 8.93333 | Sep | 1996 | Blåmusling | Højmark | 0 | 0 |  |
| 8 | 0 | L919 | 56.8 | 8.91667 | Nov | 1996 | Blåmusling | Højmark | 0 | 0 |  |


| 8 | 0 | L919 | 56.8167 | 8.93333 | Sep | 1996 | Blåmusling | Højmark | 0 | 0 |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 9 | 1 | N/A | 56.83 | 8.85433 | Aug | 2010 | Blåmusling | Aalborg | 0 | 0 |  |
| 13 | 1 | N/A | 56.6975 | 8.85417 | July | 2009 | Blåmusling | Aalborg | 0 | 0 |  |
| 13 | 1 | N/A | 56.6975 | 8.85417 | Aug | 2010 | Blåmusling | Aalborg | 0 | 0 |  |
| 13 | 1 | N/A | 56.6975 | 8.85417 | Sep | 2010 | Blåmusling | Aalborg | 0 | 0 |  |
| 13 | 1 | N/A | 56.6975 | 8.85417 | May | 2012 | Østers | Eurofins | 0 | 0 | zone 12 |
| 13 | 1 | N/A | 56.6975 | 8.85417 | June | 2012 | Blåmusling | Eurofins | 0 | 0 |  |
| 13 | 1 | N/A | 56.6975 | 8.85417 | Aug | 2012 | Blåmusling | Eurofins | 0 | 0 |  |
| 13 | 1 | N/A | 56.6975 | 8.85417 | Sep | 2012 | Blåmusling | Eurofins | 0 | 0 |  |
| 9 | 0 | T194 | 56.4881 | 8.69053 | March | 2011 | Blåmusling | Eurofins | 0 | 0 |  |
| 9 | 1 | N/A | 56.5461 | 8.64108 | Feb | 2008 | Blåmusling | Aalborg | 0 | 0 |  |



Figure 5 Locations of deleted points shown with black dots and green dots show the points with changed zone number. Red numbers indicate the current zone numbers.

After confirming the locations of the points a new table was prepared and queries were made to find all the points in each zone one by one. The results of the queries were copied to excel and the zone numbers were manually changed to the current zone numbers and copied back to the new table.

When the new master table was completed queries were made to make all the necessary tables for data analyse. Tables were made for each year, months and mussel farms. Based on these maps, risk maps were made.

Risk maps were made with vertical mapper using natural neighbouring interpolation. For this map manipulation the separate year tables were used that contained both negative and positive values of E . Coli results. In some cases dummy points were created in between two positive values when a land mass was seen in between them to improve the map. A combined risk map based on all the tests over the years were done using the built in thematic map creator due to vertical mapper not creating natural neighbouring interpolation with bigger point data table than around 2600 data points. With salmonella only an overall risk map was created using the built in thematic map function.

All risk maps were adjusted for their colour ranges. For maps done in vertical mapper: Instead the given colour distribution all values based on the natural neighbouring calculations that were under 0.5 ( 0 to 0.49 ) were considered as zero based on the common rounding method and given the same colour, all above 0.5 ,
it included were considered positive. For the two maps done with the built in thematic map function, similar manipulation was done, but in this case the colour ranges were limited to 3 : one for $0 \%, 50 \%$ and 100\%.

A map of relative $E$. Coli positive samples to total number of samples taken in each fishery zone was done by modifying the fishery table by adding a centroid $x$ and $y$ coordinate to make a query to get information about the total number of samples with in each fishery zone, the number of positive E. Coli results within the zone and a centroid location for each zone. Based on the query, a table was made and points created. When needed points were moved to the centre of the fishery manually, because the centroid position within MapInfo depends on the shape of the area and can be located outside of the area of interest. Relative number of positives was calculated by dividing the total number of positive results with total number of samples taken in the fishery zone. That was done for each zone by using update column function. Based on the table an interpolation map was created to give visual illustrations.

## Statistical analysis:

For statistical analysis the combining table from MapInfo containing only the points in Limfjorden was copypasted to a new Excel file.

Statistical analysis was done with two programs. Simpler analysis was done in excel and the main significance test was conducted in $R$.

Histograms of the data covering all the years were made by two methods. First method included query made in MapInfo asking for the count (frequency) of wanted variable and grouping it by E. Coli and the variable itself, results were copied into Excel and made into bar graphs after reordering the data. Second method used the Data analysis function in Excel that made histograms automatically. Excel was also used to calculate simple percentages to illustrate the dataset given

Before analysing data in $R$, the data had to be saved in a single sheet Excel file as Macintosh CSV file, which is easy for $R$ to read. In $R$ logistical linear regression analysis was done to analyse binary response data

Data was read into R with the command:
mussel1 <- read.csv("new_e.coli_stat3.csv", header=TRUE, sep=";", na.strings="N/A", dec=".", strip.white=TRUE)

Different specifications were given to introduce data correctly and later checked with the function head. AS R interprets all numerical data as numbers special conditions were made so R would read Zone numbers, Years and Type as categories. General linear model was conducted:

EColi1 <- glm(EColi ~ Zonenr+year+month+species+Lab+salmonella+type, data=mussel1, family="binomial") summary (EColi1)
anova(EColi1, test="Chi")

Based on the linear model an ANOVA was made to see more complete picture of the different categories effects on E. Coli response.

Due to data not being totally independent, a second approach was taken by using mixed effects model. For that, an extra R package was downloaded called Ime4, which contains better facilities for this type of models than the built in version in R. As the response variable is in binary data glmer function was used. Before model was implemented data piling was needed. For the model to run and give an estimate it needs a certain amount of data in each grid cell. Species, Lab (analysing laboratory) and salmonella were discarded from the model due to having too little data points in different grid cells and with that interrupting model from working. In case of zones, some of the zones were combined into 1 with Years. To improve power of the analysis, two zones (zone 41 and 42) were left out of the statistical analysis due to too few measurements and their position far away from rest of the fishery zones.

| ,$~ 2010-2011$ |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: | ---: |

Figure 6 Lack of data points in one of the year groups in respect to Zone numbers and Months.

|  | 1996-2002 | 2003-2005 | 2006-2007 | 2008-2009 | 2010-2011 | 2012-2013 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 2 | 16 | 62 | 54 | 36 | 40 | 9 |
| 4 | 0 | 15 | 17 | 10 | 12 | 3 |
| 5 | 2 | 0 | 0 | 125 | 30 | 27 |
| 6 | 1 | 18 | 3 | 3 | 37 | 12 |
| 7 | 3 | 16 | 0 | 1 | 22 | 12 |
| 8 | 0 | 4 | 0 | 0 | 24 | 13 |
| 9-10 | 21 | 22 | 25 | 123 | 27 | 19 |
| 11 | 2 | 0 | 0 | 4 | 0 | 13 |
| 12 | 0 | 5 | 5 | 26 | 17 | 21 |
| 13 | 2 | 4 | 6 | 21 | 19 | 22 |
| 14 | 0 | 16 | 17 | 9 | 50 | 13 |
| 15 | 12 | 16 | 21 | 4 | 32 | 49 |
| 16 | 9 | 10 | 12 | 24 | 10 | 4 |
| 17-18 | 12 | 29 | 42 | 85 | 28 | 10 |
| 19 | 1 | 1 | 62 | 129 | 37 | 30 |
| 20 | 16 | 6 | 31 | 13 | 10 | 3 |
| 21 | 2 | 2 | 29 | 5 | 2 | 1 |
| 22 | 22 | 8 | 33 | 18 | 41 | 12 |
| 25 | 27 | 2 | 38 | 21 | 2 | 9 |
| 26 | 12 | 9 | 24 | 17 | 50 | 11 |
| 27 | 3 | 32 | 29 | 23 | 38 | 18 |
| 28-29 | 1 | 4 | 1 | 0 | 4 | 60 |
| 30-31 | 6 | 9 | 38 | 33 | 16 | 20 |
| 32 | 0 | 5 | 0 | 9 | 1 | 0 |
| 33 | 16 | 9 | 1 | 16 | 19 | 10 |
| 34 | 4 | 26 | 2 | 14 | 0 | 4 |
| 35-36 | 15 | 15 | 4 | 0 | 44 | 53 |
| 37 | 21 | 25 | 25 | 10 | 0 | 6 |
| 38 | 9 | 18 | 7 | 12 | 0 | 0 |
| 39 | 0 | 6 | 16 | 9 | 2 | 2 |

Figure $7 \quad$ Illustration of combined zone numbers and the year groups made to run mixed effects model.
EColi2 <- glmer(EColi ~ ZONE+month+type+(1|YEAR), data=mussel1, family="binomial")
Model build up to see the effects of Zone, month and type on E. Coli and where the year is introduced as a random effect, meaning year doesn't have a fixed effect on the presence and absence of E.Coli in mussels.

Multiple variations of base models were conducted by removing on variable at the time, the model fit was accessed by looking at the AIC value and the models were compared with each other one by one to get significance values for each parameter, due to mixed effects model not directly providing a $P$ value.

## Results

MapInfo


Figure 8
Combined layer map showing the measurement points in 1996 in black and red, where red represents the positive E. Coli results. Underneath is a risk map based on the values where red represents positive result (1) and light blue negative value (0). Black stars are dummy points used to manipulate the map for better results.


Figure 9
Combined map from 1997 with actual measurements and a risk map. Black stands for negative $E$. Coli and red for positive, stars are once again dummy points to manipulate the graph, colour code is as described in Figure 7.


Figure 10
Map of 1998 with two samples taken in Limfjorden that are marked with black dots.
In 1998 only two samples were provided and both of them were negative, so no interpolation map was made. No data was provided for 1999.


Figure 11
Map of 2000, black dots $E$. Coli negative and red dots positive, stars represent dummy values. Underneath risk map with colours as described in Figure 7.


Figure 12
included.


Figure 13
Distribution of samples taken in 2002; black dots stand for negative result and red for positive. Risk map included.


Figure 14 Risk map for combined data of samples that were taken from 1996 to 2002.


Figure 15
Map of measurement distribution and E. Coli risk in 2003 with a risk map. Red dots are for positive and black for negative test results.


Figure 16
Map of 2004 for E. Coli risk and distribution. Red- positive, black- negative response.


Figure 17
Distribution of measurements in 2005
No positive values were found for either tested measures (E. Coli and salmonella).


Figure 18
Risk map for combined data from 2003 to 2005.


Figure 19
Distribution and a risk map of 2006 for $E$. Coli. Black dot- negative, red- positive and star is a dummy value.


Figure 20
Distribution and a risk map of 2007 for E. Coli. Black dot- negative, red-positive.


Figure 21 Risk map for combined years from 2006 to 2007.


Figure 22
Distribution and a risk map of 2008 for $E$. Coli. Distribution map has been manipulated to get more realistic interpolation map. Black- negative, red- positive and black star- dummy variables.


Figure 23
Distribution and a risk map of 2009 for E. Coli. Black dot- negative, red- positive.


Figure 24 Risk map for combined years from 2008 to 2009.


Figure 25
Distribution and a risk map of 2010 for E. Coli. Black dot- negative, red-positive.


Figure 26
Distribution and a risk map of 2011 for E. Coli. Black dot- negative, red-positive.


Figure 27
Combined risk map for years 2010 to 2011.


Figure 28
Distribution and a risk map of 2012 for E. Coli. Black dot- negative, red- positive.


Figure 29
Distribution and a risk map of $\mathbf{2 0 1 3}$ for E. Coli. Blue-green dot- negative, pink- positive.


Figure 30
Risk map for combined years from 2012 to 2013.


Figure 31 Distribution and risk map over all the years. Dots on the maps show places where $E$. Coli has been found positive. Risk map colour code: Dark blue 0, light blue 0.5 and red 1.


Only six positive values for Salmonella were found in total over the years so light blue dots are hard to notice in Figure 31. The results are better seen in the graduated map in Figure 32.


Figure 33 Graduated map of salmonella findings from 1996 to 2013. Small dots represent negative values and big dots positive values.


Figure 34 Graduated map of $E$. Coli findings from 1996 to 2013. Small dots represent negative values and big dots positive values.

For seasonality purposes similar maps were made only this time grouped by month instead of the year.


Figure 35
Combination of risk map and measured data for $E$. Coli in January including all analysed years. Black - negative and red dot positive measurements.


Figure 36
Combination of risk map and measured data for E. Coli in February including all analysed years. Black negative and red dot positive measurements.


Figure 37
Combination of risk map and measured data for E. Coli in March including all analysed years. Black - negative and red dot positive measurements.


Figure 38
Combination of risk map and measured data for $E$. Coli in April including all analysed years. Black - negative and red dot positive measurements.


Figure 39
Combination of risk map and measured data for E. Coli in May including all analysed years. Black - negative and red dot positive measurements.


Figure 40
E. Coli risk map in June including all analysed years with real measurements. Black - negative and red dot positive measurements.


Figure 41
E. Coli risk map in July including all analysed years with real measurements. Black - negative and red dot positive measurements, stars dummy values.


Figure 42
E. Coli risk map in August including all analysed years with real measurements. Black - negative and red dot positive measurements, dummy values represented with stars.


Figure 43
E. Coli risk map in September including all analysed years with real measurements. Black - negative and red dot positive measurements, stars represent dummy values.


Figure $44 \quad$ E. Coli risk map in October including all analysed years with real measurements. Black - negative and red dot positive measurements.


Figure 45
E. Coli risk map in November including all analysed years with real measurements. Black - negative and red dot positive measurements.


Figure 46
E. Coli risk map in December including all analysed years with real measurements. Black - negative and red dot positive measurements.


Figure 47
Mussel farm map covering results from all the years analysed. Black dots represent data points where E. Coli measurements were negative and red dots places where the results were positive.


Figure 48
Relative number of positive samples per total number of samples taken in each fishery and legend for the colours.

## Statistical analysis

Histograms were made to illustrate the frequency in between $E$. Coli if grouped by different categories. The data set used for this included all the data points available from all the years in Limfjorden.

Depending on the year and source, the coordinates for the studied points varied on the number of digits recorded. This variation could mean that zeroes were left out for simplification, or that a varying degree of precision took place over the years. The implications of these variations could be that a maximum of $20 \%$ of the data points could be in a false location. The distance from the correct position could vary between 20 m to almost 4 km depending on the coordinate precision shown later in Table 13.


Figure 49
E. Coli frequency based on where the sample was taken: N/A- unknown, 1- mussel farm, 0-fishery Graph on the right shows the percentage of positive results with in the different groups.

Table $3 \quad$ Values for $E$. Coli frequency grouped by type, (groups explained in Figure 48). Percentages of positive results calculated within the group and out of total measurements.

| Type | E. Coli <br> pos | E. Coli neg | Percentage of positive <br> results within the <br> group | Total | Percentage of <br> samples |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Count |  |  | collected for <br> each group |  |
| N/A | 8 | 116 | 6.45 | 124 | 4.05 |
| 1 | 54 | 768 | 6.57 | 822 | 26.83 |
| 0 | 57 | 2061 | 2.69 | 2118 | 69.13 |

More than half of the measurements were taken from the fishery that also had the lowest percentage of discovered positive results. Both the mussel farms and unknown sampling places had a similar percentage of positive results within the group.

| Type | Year | Ecoli pos | Ecoli neg |
| :---: | :---: | :---: | :---: |
|  |  | Count | Count |
| N/A | 1997 |  | 1 |
|  | 2000 | 3 | 34 |
|  | 2002 |  | 1 |
|  | 2003 | 5 | 80 |
| 1 | 2004 | 6 | 14 |
|  | 2005 |  | 3 |
|  | 2006 | 5 | 37 |
|  | 2007 | 13 | 68 |
|  | 2008 | 12 | 237 |
|  | 2009 | 4 | 161 |
|  | 2010 | 5 | 74 |
|  | 2011 | 4 | 85 |
|  | 2012 | 4 | 67 |
|  | 2013 | 1 | 22 |
| 0 | 1996 | 5 | 55 |
|  | 1997 | 2 | 26 |
|  | 1998 |  | 2 |
|  | 2001 | 3 | 37 |
|  | 2002 | 6 | 67 |
|  | 2004 | 8 | 73 |
|  | 2005 |  | 205 |
|  | 2006 | 8 | 286 |
|  | 2007 | 7 | 123 |
|  | 2008 | 4 | 214 |
|  | 2009 | 7 | 162 |
|  | 2010 | 1 | 175 |
|  | 2011 | 3 | 267 |
|  | 2012 | 2 | 284 |
|  | 2013 | 1 | 85 |



Figure 50
E. Coli frequency histogram grouped by species from all the years analysed. Graph on the right shows the percentage of positive results with in the different groups.

Table 5
Values for $E$. Coli frequency grouped by species. Percentages of positive results calculated within the group and out of total measurements.

| Species | E. Coli pos | E. Coli neg | Percentage of positive results within the group | Total | Percentage of samples collected for each group |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Count | Count |  | Species |  |
| Blåmusling | 103 | 2609 | 3.80 | 2712 | 88.51 |
| Hjertemusling | 1 | 15 | 6.25 | 16 | 0.52 |
| Musling | 14 | 87 | 13.86 | 101 | 3.30 |
| N/A |  | 2 | 0.00 | 2 | 0.07 |
| $\emptyset$ sters | 1 | 232 | 0.43 | 233 | 7.60 |

Close to $90 \%$ of all the mussels collected were blue mussels. The E. Coli findings in that group were fairly low compared to the heart mussels (clams). Musling had a high percentage of positive results, but they are most likely part of other groups.



Figure 51
E. Coli frequency histogram grouped by month from all the years analysed. Graph on the below shows the percentage of positive results with in the different groups.

Table 6
Values for E. Coli frequency grouped by month. Percentages of positive results calculated within the group and out of total measurements.

| Month | E. Coli pos | E. Coli neg | Percentage of positive results within the group | Total | Percentage of samples collected for each group |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Count | Count |  | Month |  |
| January | 5 | 83 | 5.68 | 88 | 2.87 |
| February | 8 | 103 | 7.21 | 111 | 3.62 |
| March | 11 | 482 | 2.23 | 493 | 16.09 |
| April | 1 | 405 | 0.25 | 406 | 13.25 |
| May | 7 | 371 | 1.85 | 378 | 12.34 |


| June | 11 | 258 | 4.09 | 269 | 8.78 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| July | 11 | 161 | 6.40 | 172 | 5.61 |
| August | 17 | 167 | 9.24 | 184 | 6.01 |
| September | 11 | 225 | 4.66 | 236 | 7.70 |
| October | 17 | 306 | 5.26 | 323 | 10.54 |
| November | 9 | 265 | 3.28 | 274 | 8.94 |
| December | 11 | 119 | 8.46 | 130 | 4.24 |

There is no month where there has been a lot more sampling compared to other months. The most fishing over the years has been done in March, closely followed by April, May and October. The highest E. Coli counts are in August and October, the lowest in April. April has the biggest difference in between the amount fished and positive samples found.


Figure 52 E. Coli frequency histogram grouped by lab the analysis was made, from all the years analysed. Graph on the below shows the percentage of positive results with in the different groups.

Table 7 Values for $E$. Coli frequency grouped by lab. Percentages of positive results calculated within the group and out of total measurements.

| Lab | E. Coli pos | E. Coli neg | Percentage of positive results within the group | Total | Percentage of samples collected for each group |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Count | Count |  | Lab |  |
| AnalyCen | 1 | 1 | 50.00 | 2 | 0.07 |
| Esbjerg | 4 | 14 | 22.22 | 18 | 0.59 |
| Eurofins | 14 | 971 | 1.42 | 985 | 32.15 |
| Højmark | 39 | 948 | 3.95 | 987 | 32.21 |
| Højmarklaboratoriet | 14 | 87 | 13.86 | 101 | 3.30 |
| N/A |  | 2 | 0.00 | 2 | 0.07 |
| Aalborg | 47 | 922 | 4.85 | 969 | 31.63 |

The main labs where the samples were analysed were Eurofins, Højmark and Aalborg lab, they all had low percentage of positive results, while labs that got less samples to analyse have bigger positive result production.


Figure 53
Histogram with E. Coli frequency in relation to salmonella in combination of results from all the years where data was available. Graph on the right shows the percentage of positive results with in the different groups.

Table 8
Values for $E$. Coli frequency grouped by salmonella response: positive (1) or negative (0). Percentages of positive results calculated within the group and out of total measurements.

| Salmonella | E. Coli pos | E. Coli neg | Percentage of positive results within the group | Total | Percentage of samples collected for each group |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Count | Count |  | Salmonella |  |
| 0 | 116 | 2942 | 3.79 | 3058 | 99.80 |
| 1 | 3 | 3 | 50.00 | 6 | 0.20 |

Close to all samples analysed were negative for salmonella. Total of 6 samples were identified as positive. Distribution of salmonella positive samples can be seen in Figure 31.

Table 9 summary tables of salmonella positive samples. Type : N/A- unknown, 1- mussel farm, 0-fishery, E. Coli: negative 0, positive 1.

| Zone no | Type | Ship | Month | Year | Species | Lab | Salmonella | E Coli |
| ---: | ---: | :--- | :--- | ---: | :--- | :--- | ---: | ---: |
| 15 | 0 | Limfjorden | Dec | 2007 | Blåmusling | Aalborg | 1 | 0 |
| 14 | 1 | N/A | June | 2012 | Blåmusling | Eurofins | 1 | 1 |
| 14 | 1 | N/A | June | 2006 | Blåmusling | H $\varnothing$ jmark | 1 | 1 |
| 14 | 1 | N/A | June | 2006 | Blåmusling | Højmark | 1 | 1 |
| 14 | 1 | N/A | March | 2011 | Blåmusling | Aalborg | 1 | 0 |
| 12 | 1 | N/A | Sep | 2009 | Blåmusling | Aalborg | 1 | 0 |

All of the salmonella results have been found in the blue mussels and in mussel farm samples. Half of them were also positive for E. coli at the same time and they were found in June.



Figure $54 \quad$ Histogram with $E$. Coli frequency in relation to year in combination of results from all the years where data was available. Graph on the lower shows the percentage of positive results with in the different groups.

Table $10 \quad$ Values for $E$. Coli frequency grouped by year. Percentages of positive results calculated within the group and out of total measurements.

| Year | E. Coli pos | E. Coli neg | Percentage of positive results within the group | Total | Percentage of samples collected for each group |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Count | Count |  | Year |  |
| 1996 | 5 | 55 | 8.33 | 60 | 1.96 |
| 1997 | 2 | 27 | 6.90 | 29 | 0.95 |
| 1998 |  | 2 | 0.00 | 2 | 0.07 |
| 2000 | 3 | 34 | 8.11 | 37 | 1.21 |
| 2001 | 3 | 37 | 7.50 | 40 | 1.31 |


| 2002 | 6 | 68 | 8.11 | 74 | 2.42 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 2003 | 5 | 80 | 5.88 | 85 | 2.77 |
| 2004 | 14 | 87 | 13.86 | 101 | 3.30 |
| 2005 |  | 208 | 0.00 | 208 | 6.79 |
| 2006 | 13 | 323 | 3.87 | 336 | 10.97 |
| 2007 | 20 | 191 | 9.48 | 211 | 6.89 |
| 2008 | 16 | 451 | 3.43 | 467 | 15.24 |
| 2009 | 11 | 323 | 3.29 | 334 | 10.90 |
| 2010 | 6 | 249 | 2.35 | 255 | 8.32 |
| 2011 | 7 | 352 | 1.95 | 359 | 11.72 |
| 2012 | 6 | 351 | 1.68 | 357 | 11.65 |
| 2013 | 2 | 107 | 1.83 | 109 | 3.56 |

Over the year the amount of data stored has grown. Over the resent years the positive sample number has gone down.



Figure 55
Histogram with $E$. Coli frequency in relation to year in combination of results from all the years where data was available. Graph on the lower shows the percentage of positive results with in the different groups.

Table $11 \quad$ Values for $E$. Coli frequency grouped by zone number. Percentages of positive results calculated within the group and out of total measurements.

| Zone nr | E. Coli pos | E. Coli neg | Percentage of positive results within the group | Total | Percentage of samples collected for each group |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  | Count | Count |  | Zone nr |  |
| 2 | 2 | 215 | 0.92 | 217 | 7.08 |
| 4 |  | 57 | 0.00 | 57 | 1.86 |
| 5 | 4 | 180 | 2.17 | 184 | 6.01 |
| 6 | 2 | 72 | 2.70 | 74 | 2.42 |
| 7 | 2 | 52 | 3.70 | 54 | 1.76 |
| 8 | 2 | 39 | 4.88 | 41 | 1.34 |
| 9 | 8 | 192 | 4.00 | 200 | 6.53 |
| 10 | 2 | 35 | 5.41 | 37 | 1.21 |
| 11 |  | 19 | 0.00 | 19 | 0.62 |
| 12 | 1 | 73 | 1.35 | 74 | 2.42 |
| 13 | 3 | 71 | 4.05 | 74 | 2.42 |
| 14 | 7 | 98 | 6.67 | 105 | 3.43 |
| 15 | 6 | 128 | 4.48 | 134 | 4.37 |
| 16 | 2 | 67 | 2.90 | 69 | 2.25 |
| 17 | 3 | 60 | 4.76 | 63 | 2.06 |
| 18 | 13 | 130 | 9.09 | 143 | 4.67 |
| 19 | 15 | 245 | 5.77 | 260 | 8.49 |
| 20 | 2 | 77 | 2.53 | 79 | 2.58 |
| 21 | 1 | 40 | 2.44 | 41 | 1.34 |
| 22 | 6 | 128 | 4.48 | 134 | 4.37 |
| 25 | 4 | 95 | 4.04 | 99 | 3.23 |
| 26 | 4 | 119 | 3.25 | 123 | 4.01 |
| 27 | 12 | 131 | 8.39 | 143 | 4.67 |
| 28 | 1 | 64 | 1.54 | 65 | 2.12 |
| 29 |  | 5 | 0.00 | 5 | 0.16 |
| 30 | 1 | 80 | 1.23 | 81 | 2.64 |
| 31 |  | 41 | 0.00 | 41 | 1.34 |
| 32 |  | 15 | 0.00 | 15 | 0.49 |
| 33 | 2 | 69 | 2.82 | 71 | 2.32 |
| 34 | 1 | 49 | 2.00 | 50 | 1.63 |
| 35 |  | 79 | 0.00 | 79 | 2.58 |
| 36 | 3 | 49 | 5.77 | 52 | 1.70 |
| 37 | 6 | 81 | 6.90 | 87 | 2.84 |
| 38 |  | 46 | 0.00 | 46 | 1.50 |
| 39 |  | 35 | 0.00 | 35 | 1.14 |


| 41 | 3 | 9 | 25.00 | 12 | 0.39 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 42 | 1 |  | 100.00 | 1 | 0.03 |



Figure 56 Histogram for analysing the number of decimal places in coordinates. Blue colour represents decimal place frequency for $x$ coordinate and red for $y$ coordinate.

Table 12 Frequency for number of decimal places in $x$ and $y$ coordinates with percentages of total amount of adequate coordinates.

| For x coordinate |  |  | For Y coordinate |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Bin | Frequency | $\%$ | Bin | Frequency | $\%$ |
| 5 | 2417 | 78.5 | 4 | 2450 | 79.5 |
| 4 | 286 | 9.3 | 3 | 371 | 12.0 |
| 3 | 212 | 6.9 | 2 | 181 | 5.9 |
| 2 | 114 | 3.7 | 1 | 77 | 2.5 |
| 1 | 46 | 1.5 | 0 | 1 | 0.0 |
| 0 | 5 | 0.2 | 5 | 0 | 0.0 |
| 6 | 0 | 0.0 | 6 | 0 | 0.0 |
| More | 0 | 0 | More | 0 | 0 |

Table 13
Example of coordinate precision based on $Y$ coordinate on the location of the sample site.

| Nr of <br> Decimals | Decimal <br> degrees | Northing | Location change in <br> m |
| ---: | ---: | :--- | :--- |
| 4 | 56.8342 | 6298932.26 | 0 |
| 3 | 56.834 | 6298909.998 | 22.26246476 |
| 2 | 56.83 | 6298464.749 | 467.5116092 |
| 1 | 56.8 | 6295125.389 | 3806.871036 |
| 0 | 56 | 6206081.789 | 92850.47108 |

Little over 20 \% of both coordinates were weak in their precision. As seen in Table 13 the amount of decimal points greatly affects the location of the point. That can also be seen in MapInfo looking at the points and the Zone number, some of them do not line up.

```
Model: binomial, link: logit
Response: EColi
Terms added sequentially (first to last)
\begin{tabular}{lrrrrl} 
& Df & Deviance & Resid. Df & Resid. Dev & \(\operatorname{Pr}(>C h i)\) \\
NULL & & & 2927 & 918.22 & \\
ZONE & 29 & 50.512 & 2898 & 867.71 & \(0.0079498 \quad * *\) \\
month & 11 & 57.387 & 2887 & 810.32 & \(2.824 \mathrm{e}-08\) \\
*** \\
type & 1 & 11.992 & 2886 & 798.33 & 0.0005342 ***
\end{tabular}
Signif. codes: 0 `***' 0.001 `**' 0.01 `*' 0.05 `.' 0.1 ' ' 1
Advarselsbesked:
glm.fit: fitted probabilities numerically 0 or 1 occurred
```

Figure 57 Linear model without any random effects implemented.

```
Data: mussel1
Models:
EColi2: EColi ~ ZONE + (1 + 1 | YEAR)
EColi4: EColi ~ ZONE + type + (1 + 1 | YEAR)
    Df AIC BIC logLik deviance Chisq Chi Df Pr(>Chisq)
EColi2 31 976.77 1163.5 -457.39 914.77
EColi4 32 899.88 1091.3 -417.94 835.88 78.894 1 < 2.2e-16 ***
Signif. codes: 0 `***' 0.001 `**' 0.01 v*' 0.05 `.' 0.1 v' 1
```

Figure 58 Comparison of two mixed models using ANOVA to show overall significance value for type.
There seems to be a difference in between where the samples are coming from (fishery or mussel farms).

```
Data: mussel1
Models:
EColi5: EColi ~ type + (1 + 1 | YEAR)
EColi4: EColi ~ ZONE + type + (1 + 1 | YEAR)
    Df AIC BIC logLik deviance Chisq Chi Df Pr(>Chisq)
EColi5 3 879.08 897.02 -436.54 873.08
EColi4 32 899.88 1091.30 -417.94 835.88 37.199 29 0.1412
```

Figure 59 Comparison of two mixed models using ANOVA to show overall significance value for Zone number.
No overall significance was found but in Figure 60 it can be seen that some zones are more significant, the significance values correlate well with the relative E. Coli positive graph (Figure 47).

```
Data: mussel1
Models:
EColi4: EColi ~ ZONE + type + (1 + 1 | YEAR)
EColi7: EColi ~ ZONE + month + type + (1 + 1 | YEAR)
    Df AIC BIC logLik deviance Chisq Chi Df Pr(>Chisq)
EColi4 32 899.88 1091.3 -417.94 835.88
EColi7 43 870.71 1127.9 -392.36 784.71 51.166 11 3.859e-07
---
Signif. codes: 0 `***' 0.001 `**' 0.01 \*' 0.05 '.' 0.1 v ' 1
```

Figure 60 Comparison of two mixed effects models using ANOVA to show overall significance to month.

```
Generalized linear mixed model fit by maximum likelihood ['glmerMod']
    Family: binomial ( logit )
Formula: EColi ~ zONE + month + type + (1 + 1 | YEAR)
        Data: mussel1
            AIC BIC logLik deviance
    870.7128 1127.9420 -392.3564 784.7128
Random effects:
    Groups Name Variance Std.Dev.
    YEAR (Intercept) 0.3336 0.5776
Number of obs: 2928, groups: YEAR, 6
```

|  | Estimate | Std. Error | z value | $\operatorname{Pr}(>\|z\|)$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| (Intercept) | -22.5107 | 1386.4676 | -0.016 | 0.98705 |  |
| ZONE 4 | -14.9087 | 3498.6235 | -0.004 | 0.99660 |  |
| ZONE 5 | 0.9792 | 1.1731 | 0.835 | 0.40392 |  |
| ZONE 6 | 1.8552 | 1.2672 | 1.464 | 0.14318 |  |
| ZONE 7 | 1.6407 | 1.4437 | 1.136 | 0.25575 |  |
| ZONE8 | 2.7672 | 1.2726 | 2.174 | 0.02967 | * |
| ZONE9-10 | 1.7098 | 1.0902 | 1.568 | 0.11681 |  |
| ZONE11 | -14.3863 | 5187.9504 | -0.003 | 0.99779 |  |
| ZONE12 | 0.4520 | 1.4652 | 0.308 | 0.75773 |  |
| ZONE13 | 1.5848 | 1.1977 | 1.323 | 0.18579 |  |
| ZONE14 | 1.9557 | 1.1283 | 1.733 | 0.08302 | . |
| ZONE15 | 1.9470 | 1.1069 | 1.759 | 0.07857 | - |
| ZONE16 | 1.9121 | 1.2620 | 1.515 | 0.12974 |  |
| ZONE17-18 | 2.1284 | 1.0734 | 1.983 | 0.04738 | * |
| ZONE19 | 2.0246 | 1.0787 | 1.877 | 0.06053 | . |
| ZONE20 | 1.7704 | 1.2480 | 1.419 | 0.15602 |  |
| ZONE21 | 1.6984 | 1.4434 | 1.177 | 0.23931 |  |
| ZONE 22 | 2.4931 | 1.1012 | 2.264 | 0.02358 | * |
| ZONE 25 | 1.7826 | 1.1511 | 1.549 | 0.12148 |  |
| ZONE 26 | 1.8970 | 1.1458 | 1.656 | 0.09781 | . |
| ZONE27 | 2.4654 | 1.0744 | 2.295 | 0.02175 | * |
| ZONE28-29 | 1.4817 | 1.4588 | 1.016 | 0.30977 |  |
| ZONE30-31 | 0.8628 | 1.4320 | 0.603 | 0.54684 |  |
| ZONE32 | -14.7724 | 6410.4289 | -0.002 | 0.99816 |  |
| ZONE33 | 2.0828 | 1.2524 | 1.663 | 0.09629 | - |
| ZONE34 | 1.5546 | 1.4443 | 1.076 | 0.28176 |  |
| ZONE35-36 | 1.6719 | 1.2514 | 1.336 | 0.18155 |  |
| ZONE37 | 2.5756 | 1.1196 | 2.300 | 0.02142 | * |
| ZONE38 | -15.0038 | 4002.3044 | -0.004 | 0.99701 |  |
| ZONE39 | -14.5517 | 4093.7133 | -0.004 | 0.99716 |  |
| monthAug | 17.7431 | 1386.4672 | 0.013 | 0.98979 |  |
| monthDec | 18.0246 | 1386.4672 | 0.013 | 0.98963 |  |
| monthFeb | 18.0622 | 1386.4672 | 0.013 | 0.98961 |  |
| monthJan | 17.8651 | 1386.4673 | 0.013 | 0.98972 |  |
| monthJuly | 17.2769 | 1386.4672 | 0.012 | 0.99006 |  |
| monthJune | 17.0301 | 1386.4672 | 0.012 | 0.99020 |  |
| monthMarch | 16.7055 | 1386.4672 | 0.012 | 0.99039 |  |
| monthMay | 16.1144 | 1386.4673 | 0.012 | 0.99073 |  |
| monthNov | 17.0971 | 1386.4672 | 0.012 | 0.99016 |  |
| monthoct | 17.4075 | 1386.4672 | 0.013 | 0.98998 |  |
| monthSep | 17.2308 | 1386.4672 | 0.012 | 0.99008 |  |
| type1 | 1.0868 | 0.3163 | 3.436 | 0.00059 | *** |

Figure 61 Breakdown of the main mixed effects model used for analysis.

For the model fit AIC number was accessed, which stayed relatively similar throughout all the different simulations made. In quite a few cases the standard error is very high, this comes from very low number of data points in the grids, for improvement of the data further data piling would be necessary, for example
grouping months and some extra zones. If ignoring this source of error the model seems to work for fishery zones and is comparable to map manipulations. Lacks power in respect seasonality.

## Brief summary

- The amount of data collected and stored before 2005 is low.
- Most of the mussels are collected from fisheries, while positive E. Coli samples found in them were lower compared to samples collected in the mussel farms. Mussel farms seem have higher probability to get positive results, most likely because mussel farmers were unaware of the contamination that can occur during sampling. Numbers of positive samples in mussel farms have decreased in the latter part of the period.
- No distinct zones with higher probability of positive E. coli results were found.
- No seasonality of positive E. coli results were found due the lack of evenly distributed and continuously taken samples. The standard error of the estimates was too big to believe the significance result achieved with statistical analysis.
- Salmonella positive results were in very a low numbers and no tendencies were found.

