

One Health data and website Sykdomspulsen infrastructure

MATRIX WP6 meeting

25.03.2021

Agenda

- MATRIX
 - Datasets
 - Website

- Sykdomspulsen infrastructure
 - R packages
 - Databases
 - Analysis tasks
 - Website

Sykdomspulsen team

Sykdomspulsen core:



Gry



Richard



Beatriz



Chi



Calvin

Sykdomspulsen H2020:



Clemence



David



Aurora



Doctor consultations

Weather data

MSIS data

Camphy humandata

Camphy data from NVI

Listeria data

Analysis

One Health information

One Health website

sKUHR

Doctor consultations

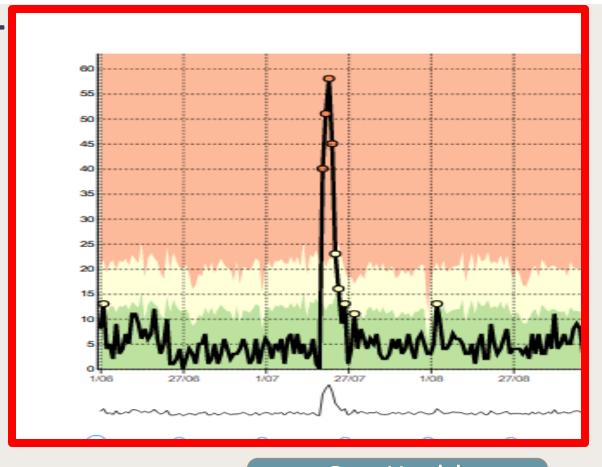
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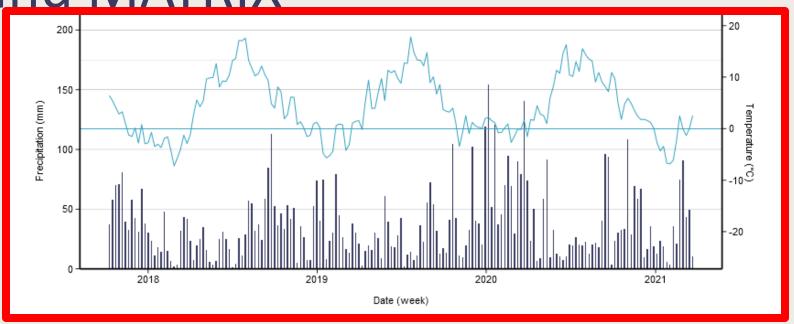
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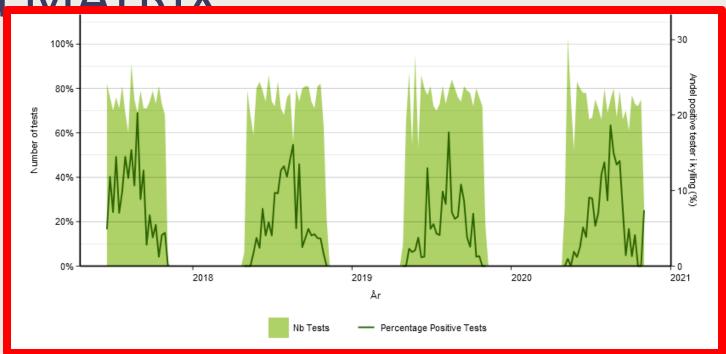
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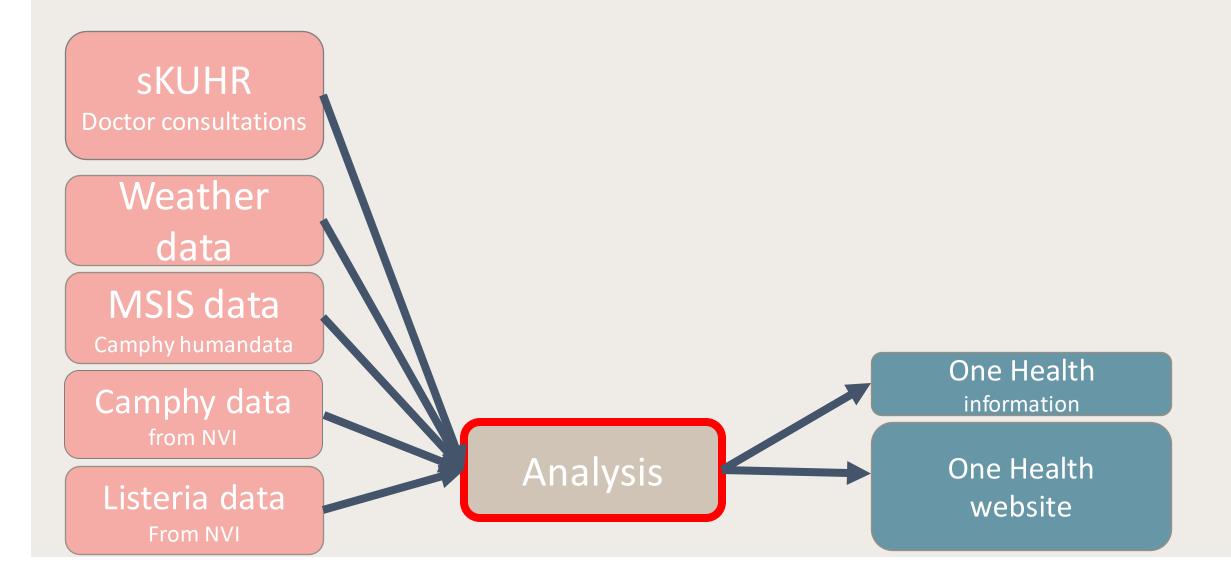
Listeria data
From NVI



Analysis

One Health information

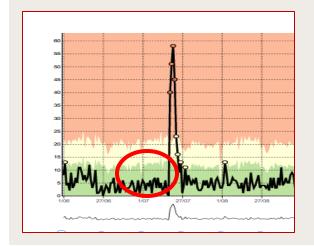
One Health website



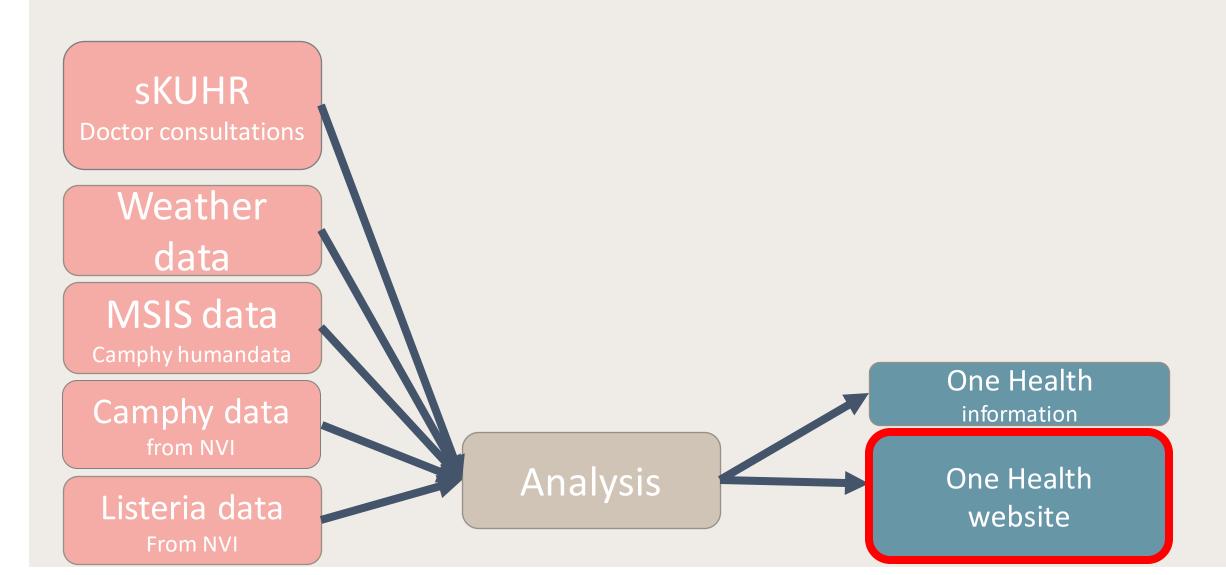












Sykdomspulsen infrastructure



Doctor consultations

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Listeria data

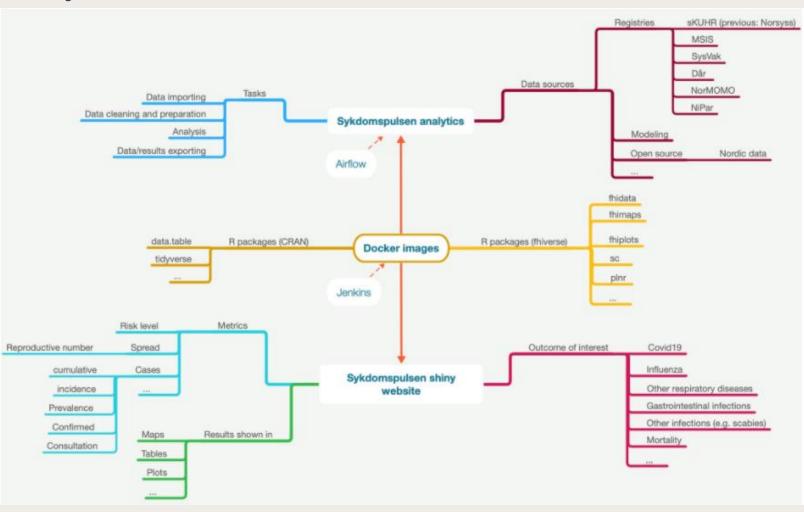
Analysis

One Health information

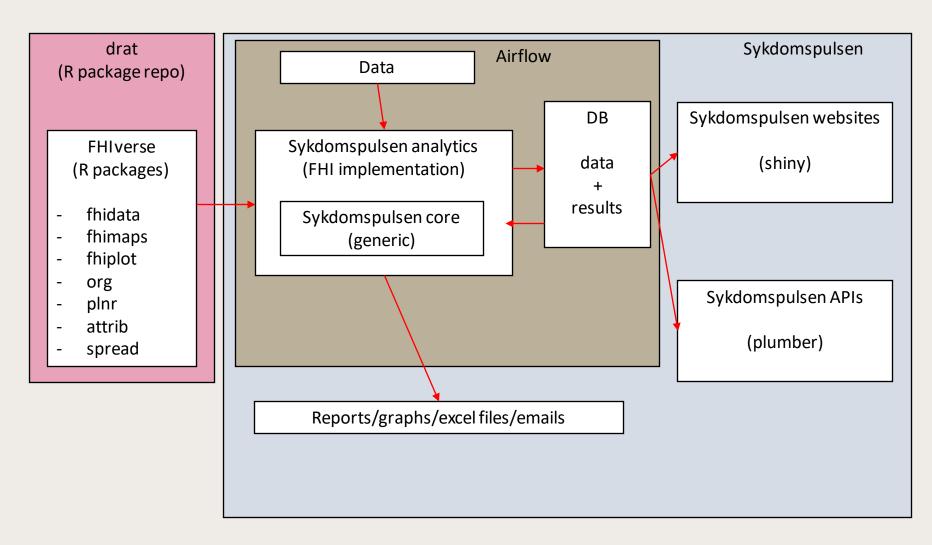
One Health website

FHI.no Sykdomspulsen NorMOMO Sykdomspulsen temaside Rapporter Nordic data NorMOMO SSI Covid-19 Influensa etc Vaccine deaths Vaccine mort sKUHR Nettside DÅR Analyse Sykdomspulsen for kommunehelsetjenesten Modellering Covid-19 Automatiske E-poster **NorMOMO** NIPar til kommuneleger **Fylkerapport** Covid-19 Død MSIS Covid-19 dagsrapporter til ledelsen+ GitHub Kommune+Fylke+Nasjonalt MSIS lab Symptometer Covid-19 Nordic Ekstra rapport covid-19 data 08.03.2021 SYSVAK Vaksine dist Covid-19 oppdateringer på API fhi.no

Sykdomspulsen



Sykdomspulsen



fhiverse

A set of R packages designed to solve analytical problems that FHI sees every day while doing real-time surveillance of infectious diseases

fhiverse

fhidata (structural data

```
> fhidata::norway_locations_names()
                                                                       fhidata::norway_population_by_age_cats(cats = list(c(0:10),c(11:20)))
                                                                             calyear
                                                                                           location_code granularity_geo age sex
                                                                                                                                        pop imputed
    location code
                    location name
                                       location name description nb
                                                                               1846
                                                                                                                  nation 00-10 total 338914
                            Norge
                                                                         2:
                                                                               1846
                                                                                                                  nation 11-20 total 266726
          county03
                             Oslo
                                                       Oslo (fylke)
                                                                               1847
                                                                         3:
                                                                                                                  nation 00-10 total 340678
                                                                                                                                              FALSE
          county11
                          Rogaland
                                                   Rogaland (fylke)
                                                                               1847
                                                                                                                                              FALSE
          county15 Møre og Romsdal
                                            Møre og Romsdal (fylke)
                                                                                                   norge
                                                                                                                  nation 11-20 total 270134
                                                                                                                  nation 00-10 total 343429
                                                                                                                                              FALSE
                          Nordland
                                                   Nordland (fylke)
          county18
                                                                                                           wardtrondheim 11-20 total
                                                                     21778:
                                                                               2023 wardtrondheim500102
                                                                                                                                               TRUE
         faregion1
                              Øst
                                           Øst (Mattilsynet-region)
                                                                               2023 wardtrondheim500103
                                                                                                                                               TRUE
                                                                                                           wardtrondheim 00-10 total
         faregion2
                        Stor-Oslo Stor-Oslo (Mattilsynet-region)
                                                                                                                                               TRUE
                       Sør og vest Sør og vest (Mattilsynet-region)
                                                                     21780:
                                                                               2023 wardtrondheim500103
                                                                                                           wardtrondheim 11-20 total
         faregion3
                                                                     21781:
                                                                               2023 wardtrondheim500104
                                                                                                           wardtrondheim 00-10 total
                                                                                                                                       5794
                                                                                                                                               TRUE
         faregion4
                              Midt
                                          Midt (Mattilsynet-region)
                                                                     21782:
                                                                               2023 wardtrondheim500104
                                                                                                                                      5571
                                                                                                                                               TRUE
                                                                                                           wardtrondheim 11-20 total
                                          Nord (Mattilsynet-region)
         faregion5
                              Nord
```

- Redistricting of municipalities/counties (happens extremely frequently in our current political climate)
- Names of locations
 - "Oslo", "Oslo (city)", "Oslo city", "Oslo municipality", "Oslo (m)", "Oslo county", "Oslo County"???????? Consistent ordering of locations in tables!
- granularity geo
 - nation, county, notmainlandcounty, missingcounty, municip, notmainlandmunicip, missingmunicip, wardoslo, extrawardoslo, missingwardoslo, wardbergen, missingwardbergen, wardstavanger, missingwardstavanger, wardtrondheim, missingwardtrondheim, baregion, region, faregion
 - We create 'data skeletons' for all granularity_geo's, so that our statisticians never need to think about "How do I deal with merging datasets that are missing rows?"
- Location hierarchy
 - Nation <-> Trondelag (county) <-> Trondheim (municipality) <-> Østbyen (ward)
- Population files
 - Also convenience functions that allow the user to aggregate to any age categories they want

fhiverse

- <u>fhimaps</u> (maps that don't require geolibraries and are consistent with fhidata naming)
 - Kommunesammenslåing 2017, 2019, 2020
 - Fylkekart, kommunekart, delt fylkekart, delt kommunekart, fylkekart med Oslo innlegg, kommunekart med Oslo innlegg
 - Labelling points for all fylke/kommuner
 - Can create a map in 5 lines of code with zero geolibrary dependencies
- **fhiplot** (lets people easily create graphs according to FHI style guidelines)
- <u>spread</u> (infectious disease spread model that is already set up to run with Norwegian structural data thanks to fhidata)
- <u>org</u> (run the same code on different computers with different folder names, fundamental to the covid daily/weekly reports)
- <u>plnr</u> (enables the creation of reports with hundreds of different data sources and hundreds of different/independent outputs fundamental to the covid daily/weekly reports)
- All researchers can use FHIverse packages, which increases the efficiency of the institute, and makes all of our analyses/outputs more consistent across different teams!

Infrastructure that allows for real time:

- Data extraction (e.g. weather data)
- Data cleaning/harmonization (100s of data sources, 100 million+ rows of data)
- Analysis (100 000+ analyses per day)
- Graph/table/report/email creation

Focus on:

- Only using statistical languages! The user will never write C#, SQL, JS, or anything besides R!
- Easy and sustainable harmonization
- Speed/high performance
- Reliability
- Easy to debug/develop with
- Sustainability when increasing number of data sources/analyses/outputs

Why do we need it?

- We didn't have a good way to handle the increasing number of data sources, analyses, and tasks
- Our old code (Versions 1-6) meant that «more data/analyses/tasks» -> more complex code
- Sykdomspulsen's (V7) level of complexity stays the same, regardless of the number of tasks!

sKUHR

```
Receive daily updates for all of Norway

Aggregate -> clean -> harmonize -> upsert -> analyse

DB table long format = 200 000 000 rows, wide format = 20 000 000 rows

Analysis combination = (age group) * (ICPC-2 code) * (fylke/kommune) *

(years) = 100 000+ analyses = 24 minutes (runs in parallel) -> 4 500 000 rows

of results
```

Excess mortality monitoring

Receive weekly updates for all of Norway

```
Aggregate -> clean -> harmonize -> upsert -> analyse
```

DB table = 2 100 000 rows

Analysis combination = (age group) * (county) * (years) = 1000 analyses = 2 minutes (runs in parallel) -> 65 000 rows of results

Attributable mortality

Analyses a combination of weather + KUHR + covid-19 + mortality Orchestration/dependency of tasks is handled externally, using Airflow

Database manager

Very explicit variable names Iso.... Seasonweek...

Redundant variables to make it easy for analysis

Consistent variable naming, which is extremely explicit

You identify unique rows of data. Sykdomspulsen core handles the rest.

```
# **** covid19 risk levels **** ----
# covid19 risk levels countyreport ----
sc::add schema(
 schema = sc::Schema$new(
   db table = "covid19 risk levels countyreport".
   db_config = sc::config$db_config,
    db field types = c(
      "granularity time" = "TEXT",
      "granularity geo" = "TEXT",
      "location code" = "TEXT",
      "border" = "INTEGER",
      "age" = "TEXT".
      "sex" = "TEXT",
     "isoyear" = "INTEGER";
      "isoweek" = "INTEGER",
     "isoyearweek" = "TEXT"
      "season" = "TEXT",
      "seasonweek" = "DOUBLE",
      "date" = "DATE",
      "msis cases n sum0 6" = "INTEGER",
      "msis cases pr100000 sum0 13" = "DOUBLE",
      "lab testevents pr1000 sum0 6" = "DOUBLE",
      "lab testevents pos pr100 sum0 6" = "DOUBLE",
      "msis areas_over_limit_numerator_n_sum0_13" = "INTEGER",
      "msis areas over limit denom n sum0 13" = "INTEGER"
   db load folder = tempdir(),
    keys = c(
      "granularity time",
     "location code",
      "date".
     "age"
      "sex"
    validator field types = sc::validator field types sykdomspulsen,
   validator_field_contents = sc::validator_field_contents_sykdomspulsen,
   info = "This db table is used for..."
```

Mandatory common fields for structural variables

Only English is allowed, except for names of things (registries: msis, sysvak, daar)

Database tables

- We create 'data skeletons' for all granularity_geo's, so that our statisticians never need to think about "How do I deal with merging datasets that are missing rows?"
- Very easy to duplicate database tables. All db tables that will be used in a website have particular prefixes (e.g. "webkht_*", "weboh_*", "fhino_api_*"). We copy from our data/analysis db tables into webkht_* db tables.
 - Very important, because vaccine data must be used in the morning report at 0630, but it's not allowed to be displayed on the website before 1300. Hence, we have two db tables: vaccine_data (updated at 0630) and webkht_vaccine_data (a duplicate of vaccine_data at 1300).
- All database table updates are automatically logged in a central db table that makes it very easy to display on our website "graph/table last updated..."

Tasks

- How literally everything is done © Data cleaning/importing, analyses, report creation, graphs, emails...
- Designed to work exactly like a single interactive independent script on your computer (line 1, line 2, line 3...)
- No loops, minimal amount of data, the "core of the problem"
 - "I have been given data for 0-4 year old males in Oslo in 2012, what analysis will I run on this data?"
- Does not need high R levels to work on editing the task

Task manager

The only permitted loops are defined in the task manager, not in the task (allows for very easy parallelization)

Arguments

What will I do with my data?

How do I get my data?

What database tables can I access?

Immediate parallelization

```
# analysis_norsyss_respiratory ----
sc::add task(
 sc::task from config v3(
    name = "analysis_norsyss_respiratory",
    for_each_plan = plnr::expand_list(
     location_code = norway_locations_long()[granularity_geo %in% c("nation", "county", "municip")]$location_code
    for_each_argset = NULL,
    universal argset = list(year start = 2016),
    upsert at end of each plan = FALSE,
    insert at end of each plan = FALSE,
   action_fn_name = "sykdomspulsen::analysis_norsyss_respiratory_action",
   _data selector fn name = "sykdomspulsen::analysis norsyss respiratory data selector",
    schema = list(
     "data norsyss wide" = sc::config$schemas$data norsyss wide,
    🔻 "results norsyss respiratory" = sc::config$schemas$results norsyss respiratory
   info = "This task analyses NorSySS respiratory (shiny)"
```

Task data selector

Allows us to jump directly into the function, like it's a normal script

Extracting the data that is required for the analysis

Restrict on location_code (comes from the plan!). This is basically "the loop".

```
analysis norsyss respiratory (data selector)
   analysis_norsyss_respiratory_data_selector = function(argset, schema){
     if(plnr::is run directly()){
       # inside here is just for testing/development
       argset <- sc::tm get argset("analysis norsyss respiratory", index plan=1)</pre>
       schema <- sc::tm get schema("analysis norsyss respiratory")</pre>
     # The database schemas can be accessed here
     # identical to sc::tbl("data norsyss wide")
     d <- schema$data_norsyss_wide$dplyr_tbl() %>%
       mandatory db filter(
         granularity_time = "week",
         granularity_geo = NULL,
          age = "total"
         sex = "total"
       dplyr::filter(location code == !! argset$location code) %>%
       dplyr::filter(year >= !!argset$year start) %>%
       dplvr::collect() %>%
       as.data.table()
     # The variable returned must be a named list
     retval <- list(
       "data_norsyss_wide" = d
7 ^
```

Task action

Can test entire task

Allows us to jump directly into the function, like it's a normal script

Code goes here. No loops!!

Upsert to database. So easy!

```
Source on Save
      analysis norsyss respiratory (action)
      @param data Data
      @param argset Argset
  #' @param schema DB Schema
6 - analysis_norsyss_respiratory_action <- function(data, argset, schema) {</pre>
  # tm run task("analysis norsyss respiratory")
    if(plnr::is run directly()){
      index plan <- 1
       index argset <- 1 # do not change
       data <- sc::tm get data("analysis_norsyss_respiratory", index_plan = index_plan)</pre>
       argset <- sc::tm get argset("analysis norsyss respiratory", index plan = index plan, index argset = index argset)
       schema <- sc::tm get schema("analysis norsyss respiratory")</pre>
    # data$data norsyss wide$location code %>% unique
    # sc::tm get plans argsets as dt("analysis norsyss respiratory")
    # code goes here
   resp_codes <- stringr::str_subset(config$def$norsyss$diag_single_with_tariff$tag_output, "^r")
    cols n <- paste0('n ', resp codes)</pre>
    cols denom <- paste0('denom ', resp codes)
    d <- data$data norsyss wide
    # select the resp codes: count and denom
    # compute percentage for selected columns
    num <- dplyr::select(d, cols n)
    denom <- dplyr::select(d, cols_denom)</pre>
    # if name match, then directly divide
    num_diagcode <- stringr::str_sub(colnames(num), start = 3, end = 100000L)</pre>
    denom diagcode <- stringr::str sub(colnames(denom), start = 7, end = 100000L)
    stopifnot(all.equal(num diagcode, denom diagcode))
    percentage <- num/denom *100
    colnames(percentage) <- paste0('pr100_', resp_codes)</pre>
    # abandon codes such as influensa, keep only necessary cols
    dd <- cbind(d[, 1:12], percentage)</pre>
    setorder(dd, yrwk)
      schema$results_norsyss_respiratory$db_upsert_load_data_infile(retval)
      # schema$results norsyss respiratory$db add constraint()
```

How do I navigate the tasks?

```
1d_config_tasks.R × analysis_norsyss_respiratory.R × config_db.R ×
Run >> Source -
Q v3
                                                             Replace All
☐ In selection ☐ Match case ☐ Whole word ☐ Regex ✓ Wrap
 3131
                   setDT(d)
                                                                                                                set_tasks
 3132
                   d
                                                                                                                **** new ****
                                                                                                                sluse move to n covid19 autoreport
 3133 ^
                                                                                                                covid19_autoreport_copy_vaccine_distribution_files_to_test
 3134
                                                                                                                covid19_autoreport_import_data_vaccine_distribution
 3135
                                                                                                                covid19_autoreport_import_data_main
                                                                                                                covid19_autoreport_clean_data_everyday
 3137
                                                                                                                covid19 autoreport clean data weekday
 3138 +
          # analysis_norsyss_respiratory ----
                                                                                                                covid19 autoreport analyse data
 3139
          sc::add task(
                                                                                                                covid19_autoreport_export_report_nation
 3140
            sc::task from config v3(
                                                                                                                covid19_autoreport_export_report_county
                                                                                                                covid19_autoreport_export_report_municip
 3141
              name = "analysis_norsyss_respiratory",
                                                                                                                covid19_autoreport_send_emails_nation
 3142
               cores = 1,
                                                                                                                covid19 autoreport send emails municip county
               for each plan = plnr::expand list(
 3143
                                                                                                                fhino_api_covid19_copy_database_table_control
 3144
                                                                                                                fhino_api_covid19_copy_database_table_production
 3145
                location_code = norway_locations_long()[granularity_geo %in% c("nation","county","
                                                                                                                webkht_covid19_sysvak_copy_database_table
 3146
                                                                                                                **** normomo ****
 3147
               for each argset = NULL,
                                                                                                                normomo_download_individ_data_from_evry
 3148
               universal_argset = list(year_start = 2016),
                                                                                                                normomo import individ data
                                                                                                                euromomo ssi analyze data
               upsert at end of each plan = FALSE,
 3149
                                                                                                                euromomo ssi send email
 3150
               insert at end of each plan = FALSE,
                                                                                                                **** skuhr ****
               action fn name = "sykdomspulsen::analysis norsyss respiratory action",
 3151
                                                                                                                skuhr_download_and_aggregate_data_from_hd_archive
 3152
               data selector fn name = "sykdomspulsen::analysis norsyss respiratory data selector",
                                                                                                                skuhr_download_and_aggregate_data_from_hd_backfill
 3153
                                                                                                                skuhr download and aggregate data from hd recent
 3154
                 "data norsyss wide" = sc::config$schemas$data norsyss wide,
                                                                                                                skuhr import data recent
 3155
                 "results norsyss respiratory" = sc::config$schemas$results norsyss respiratory
                                                                                                                **** covid risk levels ****
                                                                                                                covid19_risk_levels_analyze_data_countyreport
 3156
                                                                                                                covid19_risk_levels_export_excel_tables_countyreport
               info = "This task analyses NorSySS respiratory (shiny)"
 3157
 3158
                                                                                                                import data covid19 vax death
```

How do I remember everything?

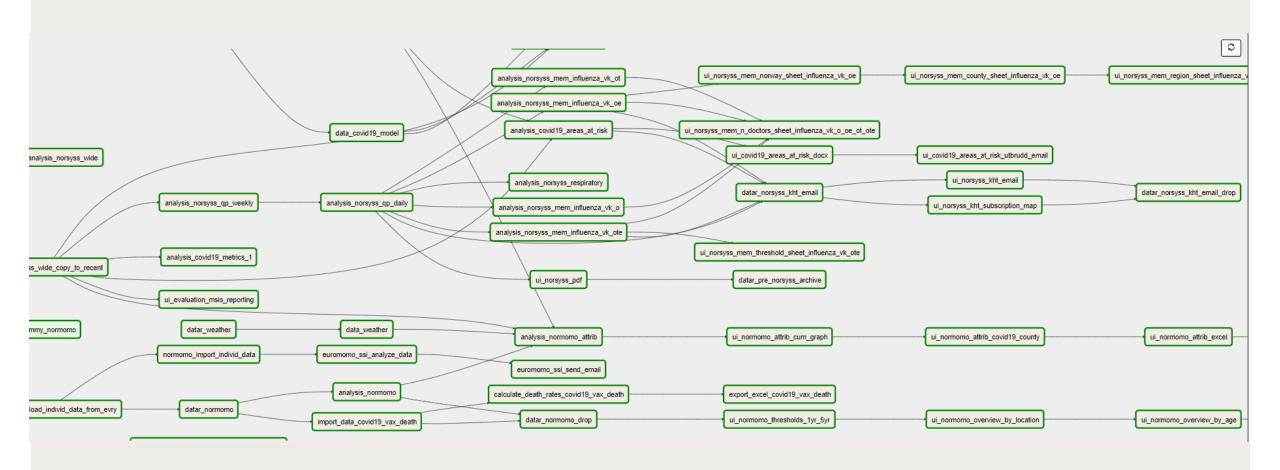
```
📟 🕶 Addins 🕶
                           Q sc
                                              alyze_data
            Insert task_inline_v1 (copy to db)
           Insert task_from_config_v3 (basic)
            Insert db schema
                                                                         10
                                                                         11
            Insert action and data selector
                                                                         12
                                                                         13
📈 🔚 🗀 Source on Save | 🔫 🧪 🔻
                                                                         16
! ▼ # TASK NAME ----
                                                                         17
# tm run task("TASK NAME")
                                                                         18
sc::add task(
                                                                         19
    sc::task from config v3(
                                                                         20
      name grouping = "TASK GROUPING",
                                                                         21
      name action = "TASK ACTION",
                                                                         22
      name variant = "TASK VARIANT",
                                                                         23
      plan argset fn name = NULL, # "PACKAGE::TASK NAME plan argset"
      for each plan = plnr::expand list(
                                                                         26
       x = 1
                                                                         27
      for each argset = NULL,
                                                                         29
      universal argset = NULL,
                                                                         30
      upsert at end of each plan = FALSE,
                                                                         31
      insert at end of each plan = FALSE,
                                                                         32
      action fn name = "PACKAGE::TASK NAME action",
                                                                         33
      data selector fn name = "PACKAGE::TASK NAME data selector",
                                                                         34
      schema = list(
                                                                         35
        "SCHEMA NAME" = sc::config$schemas$SCHEMA NAME
                                                                         36
      info = "This task does..."
```

Tools Help

```
2 * # XGROUPX XVARIANTX ----
   sc::add schema(
     schema = sc::Schema$new(
       db table = "XGROUPX XVARIANTX",
       db_config = sc::config$db_config,
       db field types = c(
         "granularity time" = "TEXT",
         "granularity geo" = "TEXT",
         "location_code" = "TEXT",
         "border" = "INTEGER".
         "age" = "TEXT",
         "sex" = "TEXT",
         "isovear" = "INTEGER".
         "isoweek" = "INTEGER",
         "isoyearweek" = "TEXT",
         "season" = "TEXT",
         "seasonweek" = "DOUBLE".
         "date" = "DATE",
         "XXXX" = "DOUBLE"
       db load folder = tempdir(),
       keys = c(
         "granularity time",
         "location code",
         "date",
         "age",
         "sex"
       validator field types = sc::validator 35
       validator field contents = sc::validat 36
       info = "This db table is used for..." 37
```

```
🖒 🔊 🔚 🗌 Source on Save 🔍 🎢 🗸
 2 * # **** action **** ----
       TASK NAME (action)
        @param data Data
        @param argset Argset
       @param schema DB Schema
 7 #' @export
 8 - TASK NAME action <- function(data, argset, schema)
      # tm run task("TASK NAME")
10
11 -
      if(plnr::is run directly()){
12
        # sc::tm get plans argsets as dt("TASK NAME")
13
14
        index plan <- 1
15
        index_argset <- 1
16
17
        data <- sc::tm get data("TASK NAME", index plan = index plan)
18
        argset <- sc::tm get argset("TASK_NAME", index_plan = index_plan, index_argset = index_argset)</pre>
19
        schema <- sc::tm get schema("TASK NAME")</pre>
20 -
21
22
     # code goes here
23 ^ }
24
25 * # **** data selector **** ----
26 #' TASK NAME (data selector)
       @param argset Argset
28 #' @param schema DB Schema
29 #' @export
30 → TASK NAME data selector = function(argset, schema){
31 • if(plnr::is run directly()){
32
        # sc::tm get plans argsets as dt("TASK NAME")
33
        index plan <- 1
        argset <- sc::tm_get_argset("TASK_NAME", index_plan = index_plan)</pre>
        schema <- sc::tm get schema("TASK NAME")</pre>
38 *
39
      # The database schemas can be accessed here
      d <- schema$SCHEMA NAME$dplyr tbl() %>%
        dplyr::collect() %>%
43
        as.data.table()
      # The variable returned must be a named list
46
      retval <- list(
        "NAME" = d
     # **** functions **** $
invironment History Connections Build Git Tutorial
```

Task orchestration (airflow)



How do we implement it?

- We have two parallel systems
 - Sykdomspulsen analytics automatic
 - Sykdomspulsen analytics interactive
- Both have their own databases, airflow implementations, and folders
- Sykdomspulsen analytics interactive also has an active Rstudio Server installation
 - Extremely fast, low latency, close to the data
 - Only text is transmitted to the user
 - User just needs to use an internet browser
 - Can work for 8 hours remotely, using datasets that are 200 000 000 rows, and only use 50 MB of internet data

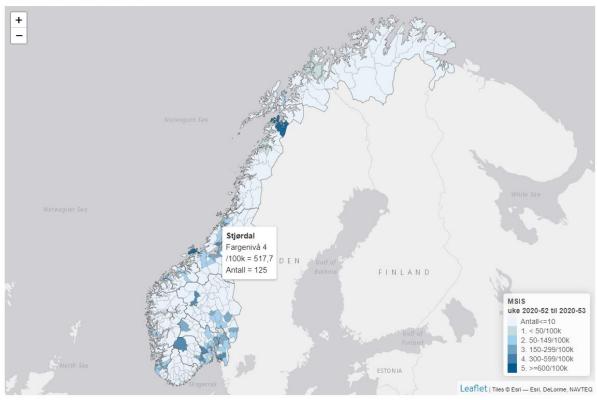
How do we implement it?

- We use docker containers to:
 - Freeze R packages
 - Ensure that all statisticians have exactly the same environment as the production environment
 - Ensure that we can update everything instantaneously, without having any issues or forgetting anything/anyone

- Implemented using the «shiny» R package
- Production/test websites are implemented in Docker containers
- Interactive development:
 - Was done via Rstudio locally installed on a windows computer
 Is now done via Rstudio Server
- Code is very similar to code used to produce the daily/weekly report, so there are efficiencies there as well
- Uses same «fhiverse» R-packages as Sykdomspulsen Analytics
- Fetches the data/results directly from the SQL databases (using R wrappers)
- Manipulates the data using the gold-standard R packages designed for these tasks
- Produces graphs/tables using the gold-standard R packages designed for these tasks

Efficient development

Figur 1b. Kommunekart med nye covid-19 tilfeller i løpet av de to siste fulle ukene pr. 100.000 innbyggere. Dataene kan endres hver dag da de ofte ikke er komplette for forrige uke i begynnelsen av en ny uke, men blir mer og mer komplett utover uka. Kommuner med under 10 tilfeller de siste 14 dagene er farget veldig lys blå/hvit.



- Interactive map comes from «fhimaps»
- 40 lines of code

```
ui_a <- leaflet::leaflet(
pd_county,
options = leaflet::leafletOptions(preferCanvas = F)
) %>%

leaflet::addProviderTiles(leaflet::providers$Esri.WorldGrayCanvas) %>%

leaflet::addPolygons(

fillColor = ~ pal_not_censored(n_0_13_fixed_status_with_numbers),
weight = 0.3,
opacity = 1,
color = "white",
fillOpacity = 0.9,
highlight = leaflet::highlightOptions(
weight = 5,
color = "#80",
fillOpacity = 0.7,
bringToFront = F

// bringToFront = F

// label = lab_a,
labelOptions = leaflet::labelOptions(
textsize = "15px"

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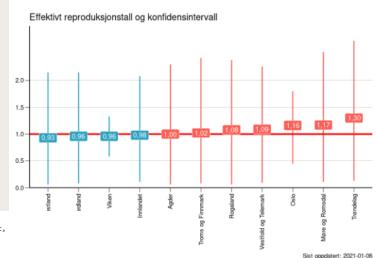
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```

Efficient development



```
q <- ggplot(d_county, aes(x = location_name_fct,</pre>
                           y = r_est,
                           label = fhiplot::format_nor(r_est, digits=2)))
q <- q + geom_pointrange(aes(ymin = r_threshold10,</pre>
                              ymax = r thresholdu0),
                          size = 0.8)
q <- q + geom_hline(aes(yintercept = 1),</pre>
                     color = 'red', size = 1.2)
q <- q + geom_label(aes(fill = factor(rabove1)),</pre>
                    colour = 'white')
q \leftarrow q + scale_y = c(0, 0.5, 1, 1.5, 2),
                            expand = expansion(mult = c(0.0, 0.1)))
q <- q + expand_limits(y=0)</pre>
q <- q + fhiplot::scale_color_fhi(palette = 'posneg')</pre>
q <- q + fhiplot::scale fill fhi(palette = 'posneg')</pre>
q <- q + fhiplot::theme_fhi_lines_horizontal(panel_on_top = F)</pre>
q <- q + fhiplot::set_x_axis_vertical()
q <- q + theme(axis.title.x = element_blank(),</pre>
                axis.title.y = element_blank(),
                legend.position = 'none') +
  labs(title = 'Effektivt reproduksjonstall og konfidensintervall',
       caption = paste0('Sist oppdatert: ', date_model_was_run))
```

- 25 lines of code
- Can iterate and test a new version of the graph in under 10 seconds
- Incredibly fast development
- Incredibly flexible
- Perfect for the pandemic!!!
- Uses «fhiplot» so that the styles/colors/themes are the same on the website and in all reports

Key features for success

- Having a very strong analytics platform producing extremely standardized database tables
- Ability to duplicate database tables very easily at given time points
- Fhiverse R-packages and tutorials ensuring consistent output throughout the institute, and ensuring that all "structural data" is 100% identical in all analyses/infrastructure and easily updated
- Using statistical languages (R) everywhere
- Docker images ensuring 100% consistent environments for all users on all servers