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# Tolerance Analysis with SyMSpace

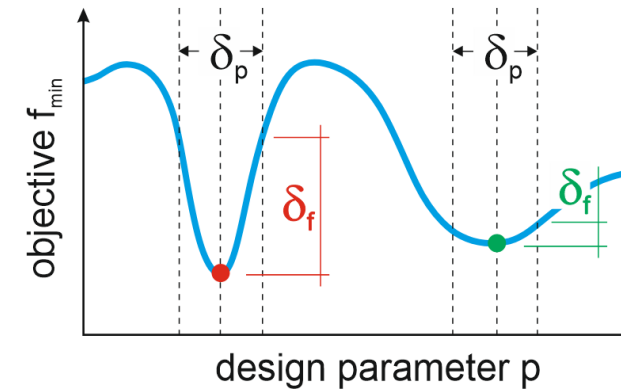
SyMSpace Days 2024  
September 18-19, Linz



# Motivation

# Motivation

- With increasing capabilities of design tools (e.g. SyMSpace ;-), highly optimized systems can be achieved
- Unfortunately, highly optimized systems are prone to be highly sensitive
- “Reality is seldom ideal”
- Effects like
  - Material uncertainties
  - Part- and assembly tolerances
  - Variations of external influences
  - ...can make a (nominally) optimal system behave bad!

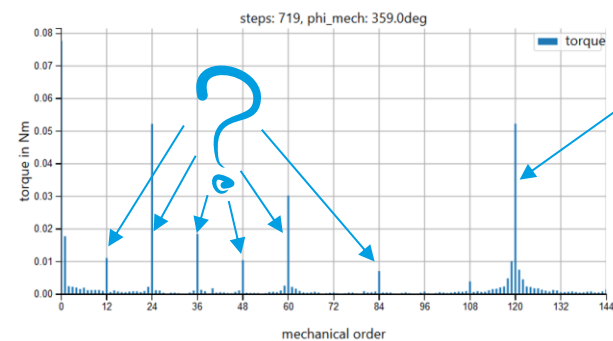
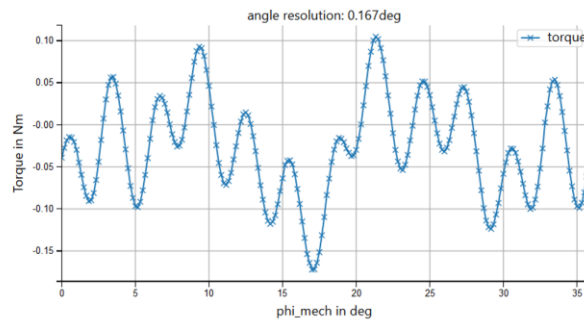
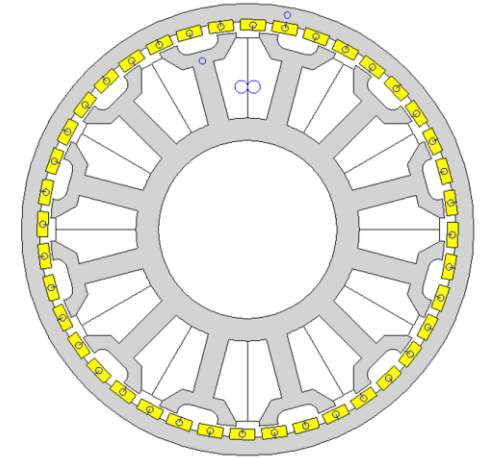


Low sensitivity against uncertainties  
is crucial for a robust design!

# Motivation

## 10-fold higher cogging torque measured than simulated!

- Vernier machine
  - $T_n = 2\text{Nm}$
- Estimated cogging torque with SyMSpace standard motor project
  - $T_{r,cogg,pp} \sim 0.03\text{ Nm}$
- Measured cogging torque
  - $T_{r,cogg,pp} \sim 0.28\text{ Nm}$



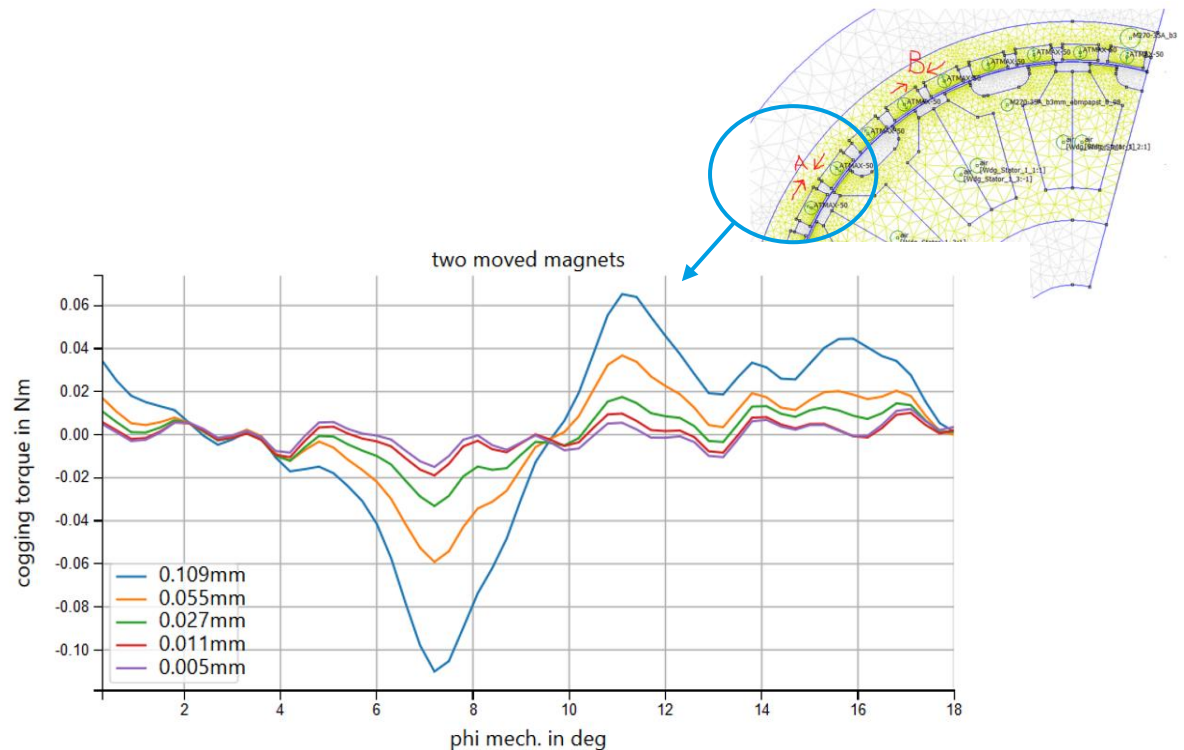
first harmonic order to be expected from theory!

# Motivation

## Where do the lower harmonics come from ?

- Testing ...
  - various mesh settings
  - different calculation methods (e.g. sliding band boundary in the airgap)
  - eccentricity of rotor/stator
  - full/sector mode
  - material degradation
  - ... showed minor (negligible) influence on cogging torque
- **Displacing magnets** showed **significant influence!**

Starting Point of SyMSpace Tolerance Framework



# Agenda

- SyMSpace Framework for Tolerance Analysis
- Tolerable Geometry Models
- Sensitivity Analysis using **Cumulative-Distribution-Functions** (CDFs)
- Examples
  - Impacts of an asymmetric slot on the cogging torque of a PMSM
  - Driving range sensitivity analysis of a BEV
- Tolerances and Optimization (Outlook)

# SyMSpace Tolerance Framework

## Tolerance Analysis in SyMSpace

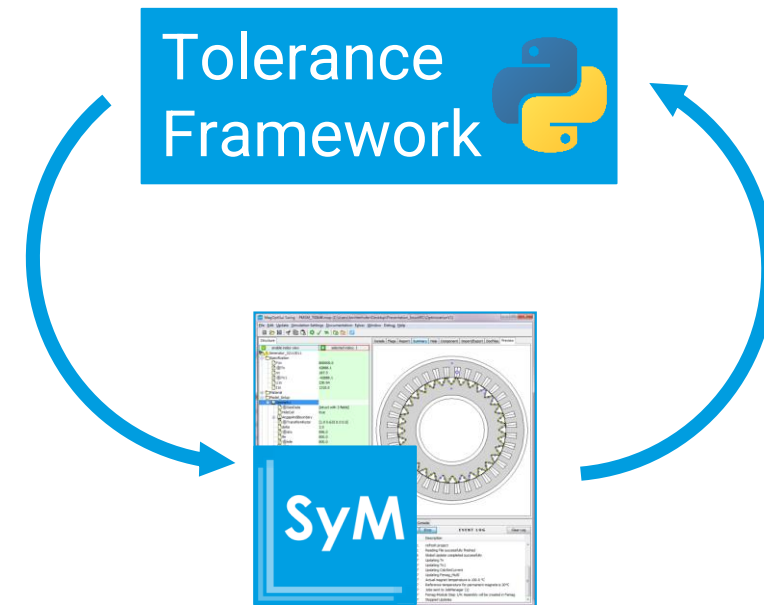
Implementation, Setup, How-To

# Tolerance analysis in SyMSpace

... under construction ...



- Framework for tolerance analysis is still in beta phase
- Controlled via command line over SyMSpace Python Console
- No automated post-processing workflow yet (as, e.g., for standard motor projects)





# Tolerance analysis in SyMSpace

## Defining tolerance affected variables and results

The screenshot shows the SyMSpace Center interface with two detail panels. The top panel is for the variable 'bm\_shift\_rel' and the bottom panel is for the result 'torque\_pp'.

Structure	Value
enable index view	
x_hm	0.7
hm	2.17
hm_gap	0.0
hrm	2.17
x_bm	0.83
bm	4.05819
bm_gap	0.1
brm	4.15819
tr1	0.4
hm_offset	0.01
hm_tol	0.1
bm_tol	0.1
bm_shift_rel	[real 1x40 row vector]
bm_tol_rel	[real 1x40 row vector]
hm_offset_rel	[real 1x40 row vector]
hm_tol_rel	[real 1x40 row vector]
bm_minus_hm	1.88819

Structure	Value
ProjectName	
Specification	
Material_Library	
Geometry	
PMSM	
Simulation_Setup	
Boundary	
Femm_Simulate	
noLoad_postprocessir	
torque_pp	0.0785037
flux_thd	76.5147
flux_pp	0.023789

`@Tolerance{"var":{"uniform":{"lower_tol":1,"upper_tol":1}}}`

define nominal value (tolerance is added)

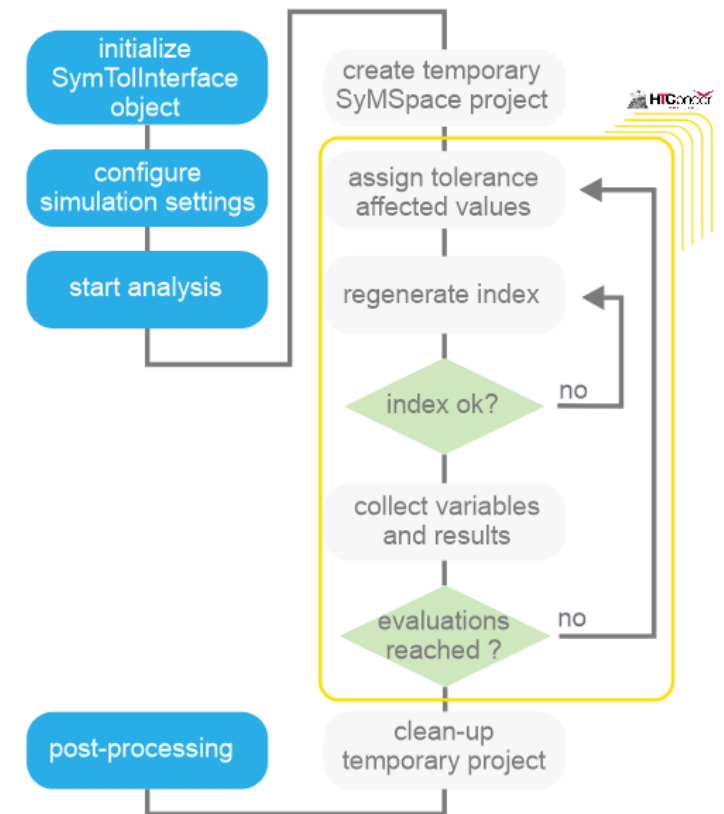
`@Tolerance{"res":{}}`

- define tolerance affected parameters using `@Tolerance{}` keyword in comments field
- `@Tolerance{}` information provided in json format

# Tolerance analysis in SyMSpace

## Workflow/ Analysis

- Prototype implementation: `SymTolInterface` python class
  - Sphinx documentation available, describing basic workflow step by step
- Create instance assigning SyMSpace project handle within SyMPython Console  
`sti = SymTolInterface(CurProject)`
- Configure simulation settings
- Start tolerance analysis with `sti.start()`
  - project tree is analyzed for `@Tolerance` keywords
  - original SyMSpace project is cloned
  - indices are processed similar to Optimizer
  - folder `<SymProject>.tol.files` (similar to `<SymProject>.mop.files`) is created to store full index data if desired
  - variables and results of analysis are pickled
- For postprocessing of scalar results: (e.g., Tcogg,pp)
  - functions to evaluate CDF and related confidence parameters and visualization functions are available



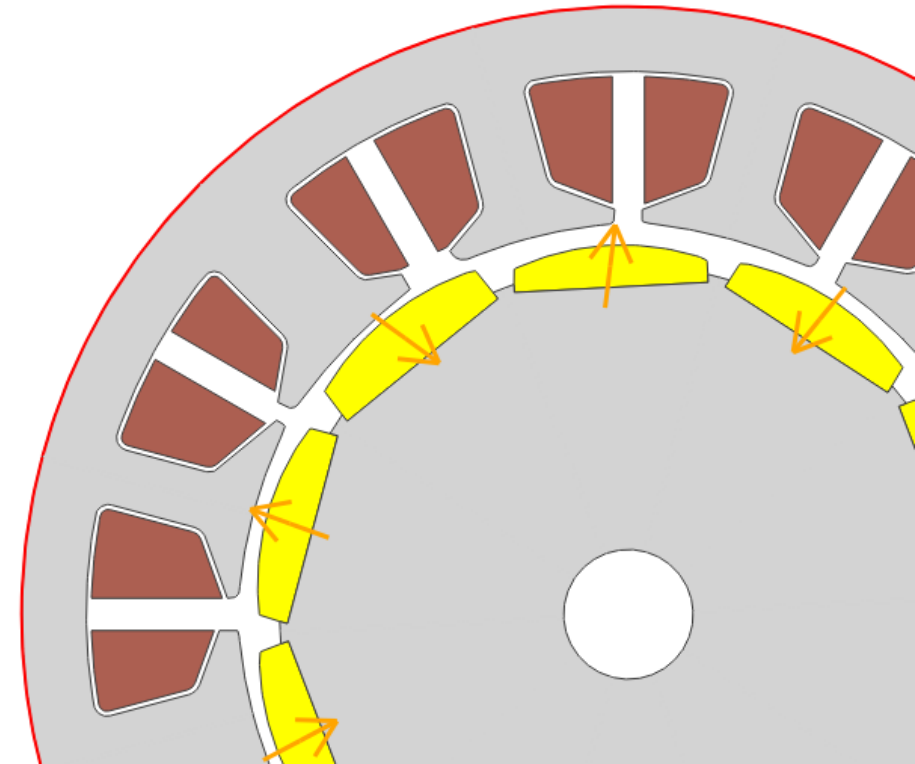
# Tolerable Geometry Models

Classes, Implementations,  
Restrictions

# Tolerable Geometry Models

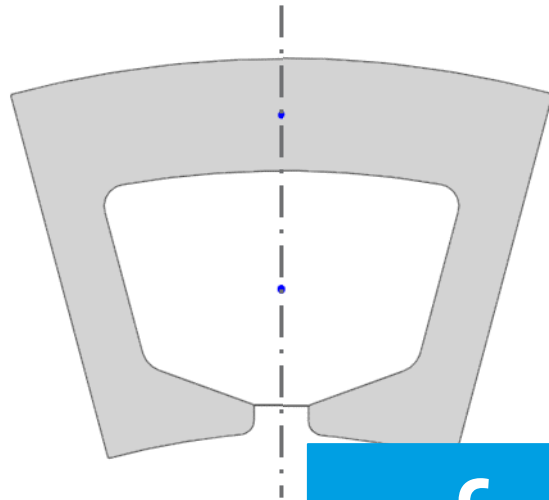
## Implementation (alpha status)

- Functionality is added to the segment geometries (python script based)
- Functions implemented in a separate development branch of SyMSpace
  - as it is alpha status → need for verification and use cases
  - separate installer can be provided
- All script based stator and rotor topologies are capable to apply tolerances (CAD models don't work)
  - few adaptations necessary to the geometry definition



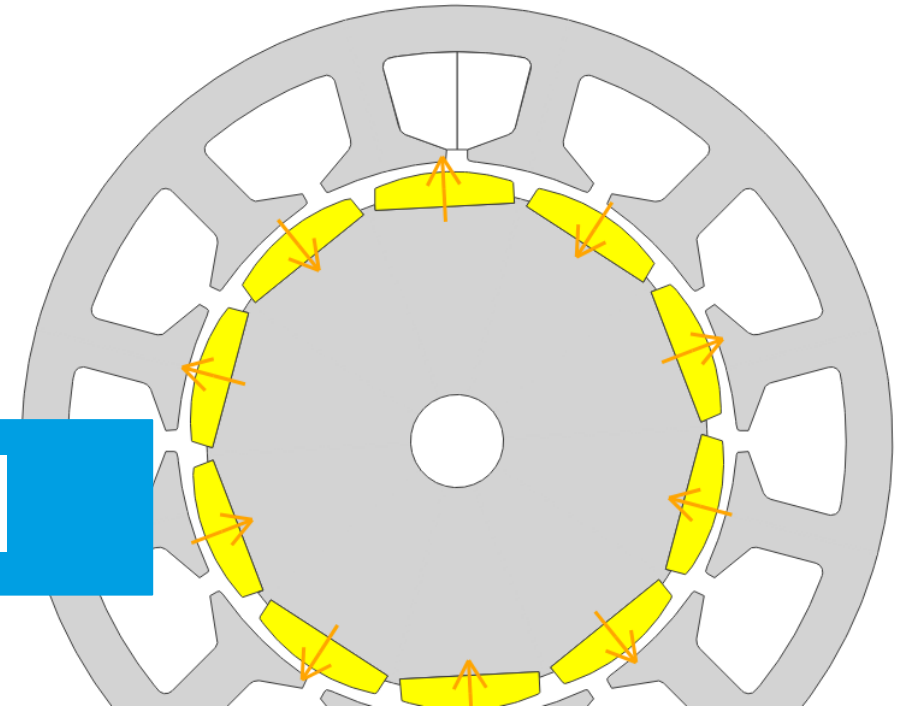
# Tolerable Geometry Models

## Standard Segment-Geometry Modeling



1. defining one half of the slot/pole
2. mirroring of the half to obtain one complete slot/pole configuration
3. Segment of the slot/pole is duplicated  $N_s$  resp.  $2 \cdot p_z$  times and transformed to obtain the entire cross-section

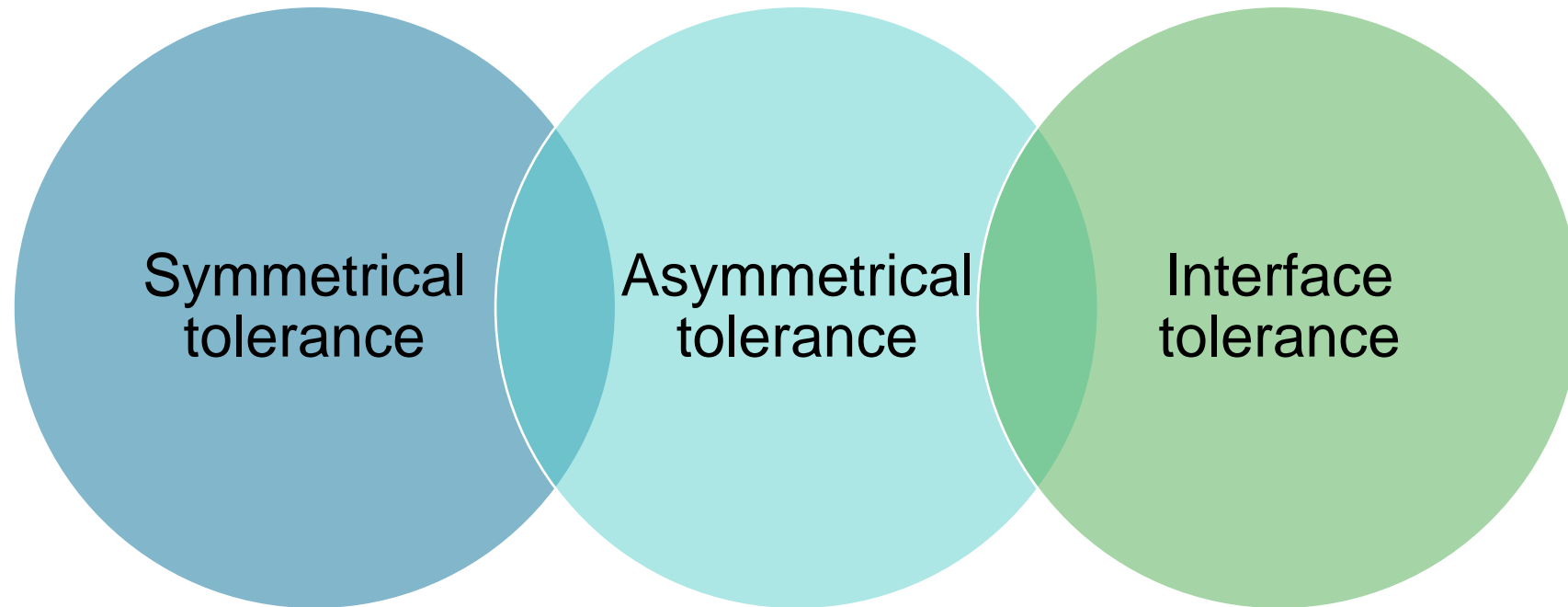
fully symmetrical



# Tolerable Geometry Models

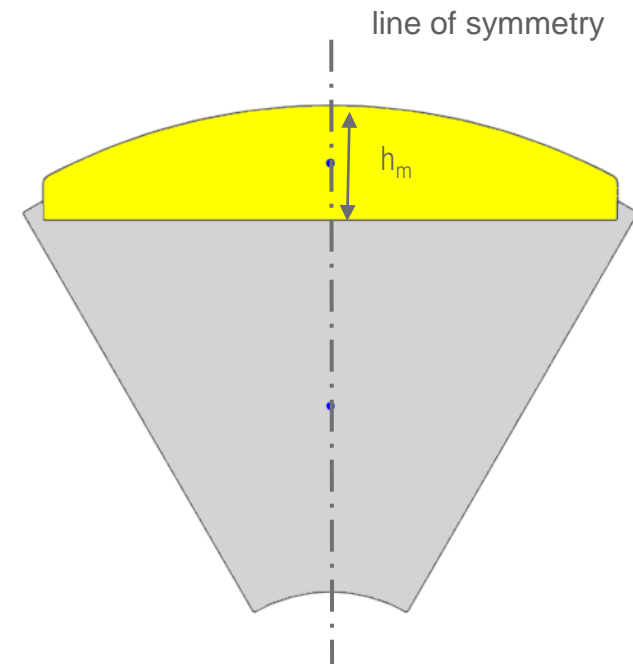
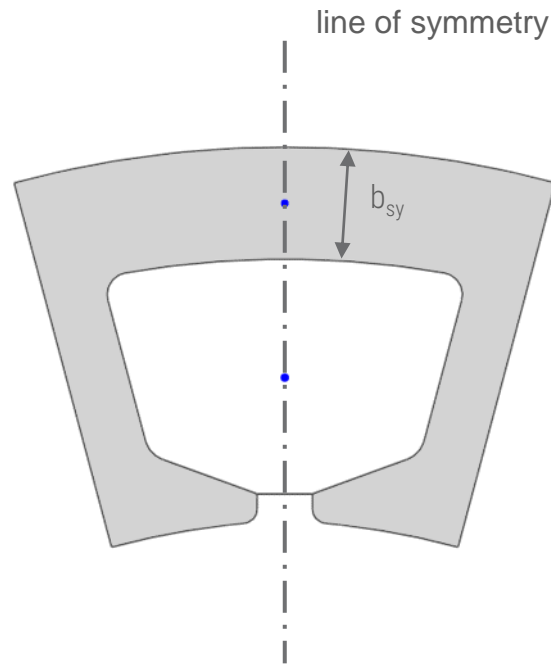
## Segment-related Tolerance Classes

3 different tolerance classes are implemented



# Tolerable Geometry Models

## Symmetrical Tolerance



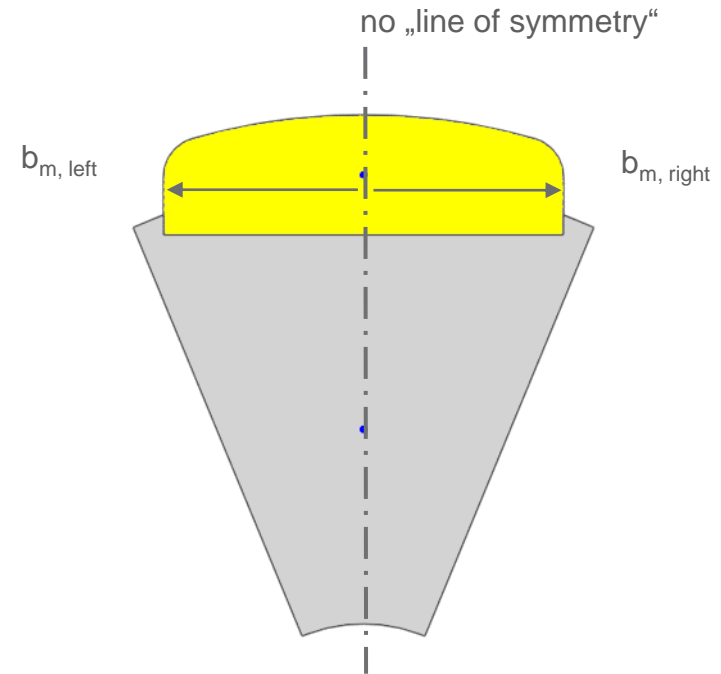
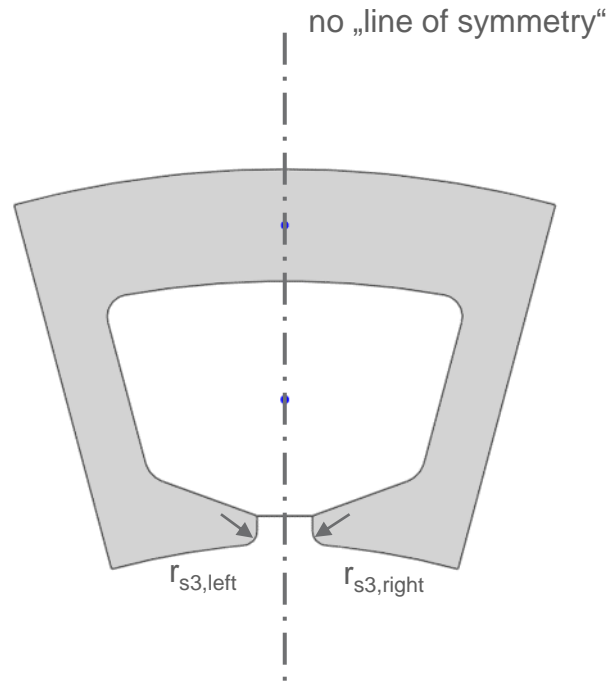
symmetrical tolerance values are provided by a  $[1 \times N_s]$  resp.  $[1 \times 2 \times p_z]$  vector. e.g. for  $N_s = 12$

bsy\_\_tol =

	0	1	2	3	4	5	6	7	8	9	10	11
0	-0.1	1.5	-0.8	0.2	0.0	0.5	-0.5	0.2	0.3	-0.3	0.4	-0.2

# Tolerable Geometry Models

## Asymmetrical Tolerance



asymmetrical tolerances are provided by a  $[2 \times N_s]$  resp.  $[2 \times 2^*p_z]$  vector. e.g.  $N_s = 12$ ;

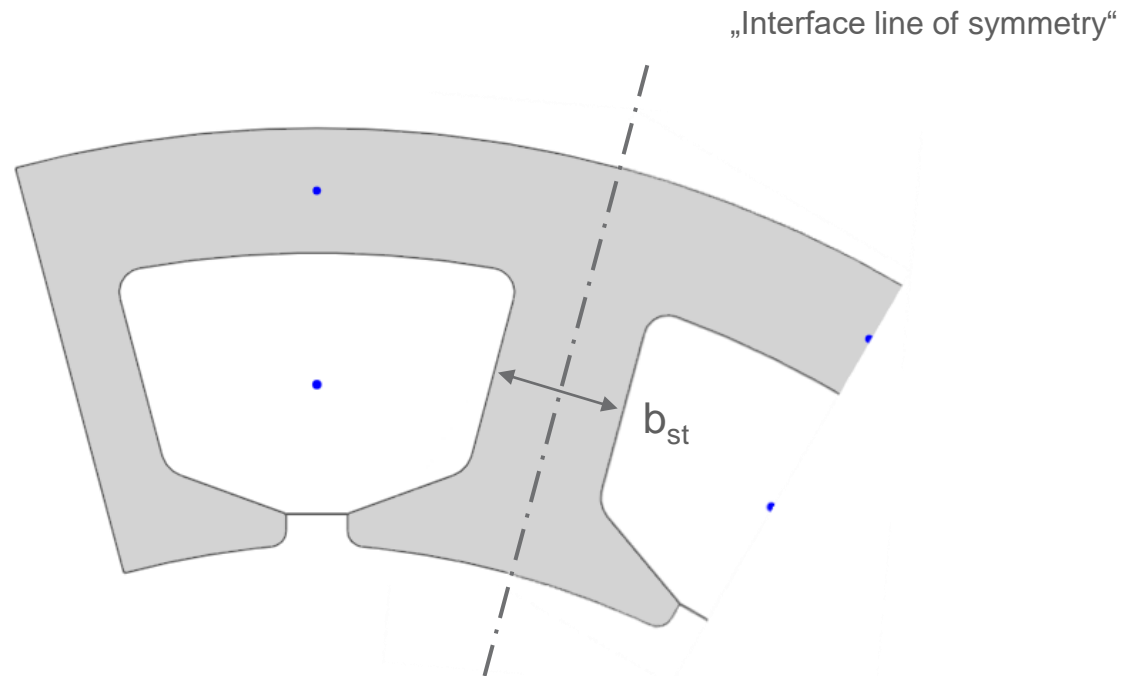
rs3\_\_tol =

	0	1	2	3	4	5	6	7	8	9	10	11
0	-0.1	0.15	-0.05	0.2	0.0	0.18	-0.06	0.12	0.03	-0.13	0.14	-0.2
1	0.1	-0.15	0.05	-0.2	-0.0	-0.16	0.08	-0.18	-0.07	0.15	-0.11	0.2



# Tolerable Geometry Models

## Interface Tolerance



Interface Toleranzen werden mit einem  $[1 \times N_s]$  bzw.  $[1 \times 2 \cdot p_z]$  Vektor angegeben. z.B.:  $N_s = 12$ ;

`bst__tol =`

	0	1	2	3	4	5	6	7	8	9	10	11
0	-0.1	1.5	-0.8	0.2	0.0	0.5	-0.5	0.2	0.3	-0.3	0.4	-0.2

# Tolerable Geometry Models

## Definition of a Tolerance Class for a Parameter

- Appending tolerance class information to the variable definition
- The tolerance field for the related parameter is added automatically as import variable of the geometry

```
def geometryVars(self) -> list:
    """Geometry variables..."""
    geovar = [
        ('Ns', 'Number of slots', '', False, 'Numeric / [1 x 1]', 12, 'none'),
        ('dso', 'Stator outer diameter', 'mm', False, 'Numeric / [1 x 1]', 75.0, 'none')
        ('dsi', 'Stator inner diameter', 'mm', False, 'Numeric / [1 x 1]', 48.0, 'none')
        ('bst', 'Width stator tooth', 'mm', False, 'Numeric / [1 x 1]', 4.3, 'interface'),
        ('bsy', 'Stator yoke width', 'mm', False, 'Numeric / [1 x 1]', 4.0, 'none'),
        ('hss', 'Pole shoe height', 'mm', False, 'Numeric / [1 x 1]', 1.0, 'interface'),
        ('bss', 'Slot opening', 'mm', False, 'Numeric / [1 x 1]', 2.0, 'symmetric'),
        ('rs1', 'Radius slot 1', 'mm', False, 'Numeric / [1 x 1]', 0.8, 'none'),
        ('rs2', 'Radius slot 2', 'mm', False, 'Numeric / [1 x 1]', 1.0, 'none'),
        ('rs3', 'Radius slot 3', 'mm', False, 'Numeric / [1 x 1]', 0.5, 'asymmetric'),
        ('phis1', 'Pole shoe angle', 'deg', False, 'Numeric / [1 x 1]', 125, 'interface'),
        ('est', 'Stator tooth eccentricity', 'mm', False, 'Numeric / [1 x 1]', 5.0, 'interface')
    ]
    return geovar
```

# Tolerable Geometry Models

## Splitting the Geometry to Half Segments

- each half segment is parametrized differently in general because of asymmetrical or interface tolerances
- necessary to split up geometry script
- add code which handles left and right half creation to main geometry definition

This part is intended to be redesigned for easier use in future!

```
def geometry(self, param: dict, part: Geometry2D) -> None:
    """Geometry of stator segment..."""
    isTol = False
    for pv in param.values():
        if isinstance(pv, list) or isinstance(pv, np.ndarray):
            isTol = True
            break
    if not isTol:
        dso = param['dso']
        dsi = param['dsi']
        bsy = param['bsy']
        hss = param['hss']
        pnt = self.halfSegment(param=param, part=part)
        elem = part.mirror(Line(*args: [0, 0], [0, 1]), copy=True)
        # Line coil - closing coil area
        pnt_hss = pnt
        elem.append(Line(*args: pnt_hss, np.array([-pnt_hss[0], pnt_hss[1]])))
        part.addSegment(elem)

        paramTolClass = self.getGeometryVarToleranceClass()
        for i in range(2):
            for k, v in paramTolClass.items():
                if v != 'none':
                    p[k] = param[k][i] if isinstance(param[k], list) else param[k]
            tmpPart = Geometry2D()
            pnts.append(self.halfSegment(param=p, part=tmpPart))
            if i == 1:
                tmpPart.mirror(axis=Line(*args: [0, 0], [0, 1]), copy=False)
            for j in range(tmpPart.numseg):
                part.addSegment(tmpPart.getSegment(j))
```

# Tolerable Geometry Models

## Import fields for tolerance parameters

- tolerance fields are always optional
  - not all have to be assigned
  - can be left empty
- proper dimension is checked and error displayed if violated
- dimension requirement is also shown at mouse-over on import variable
- tolerance value is added to nominal value with sign

The screenshot shows the SyMSpace Center software interface. The title bar indicates the file path: 'SyMSpace Center - TOL\_StatorCS020.mop (D:\# 003 P R O J E K T E\# 003\_TOLeranceScriptGeometries)'. The menu bar includes File, Edit, Update, Simulation Settings, Documentation, Extras, Window, Debug, and Help. The toolbar contains various icons for file operations and simulation settings.

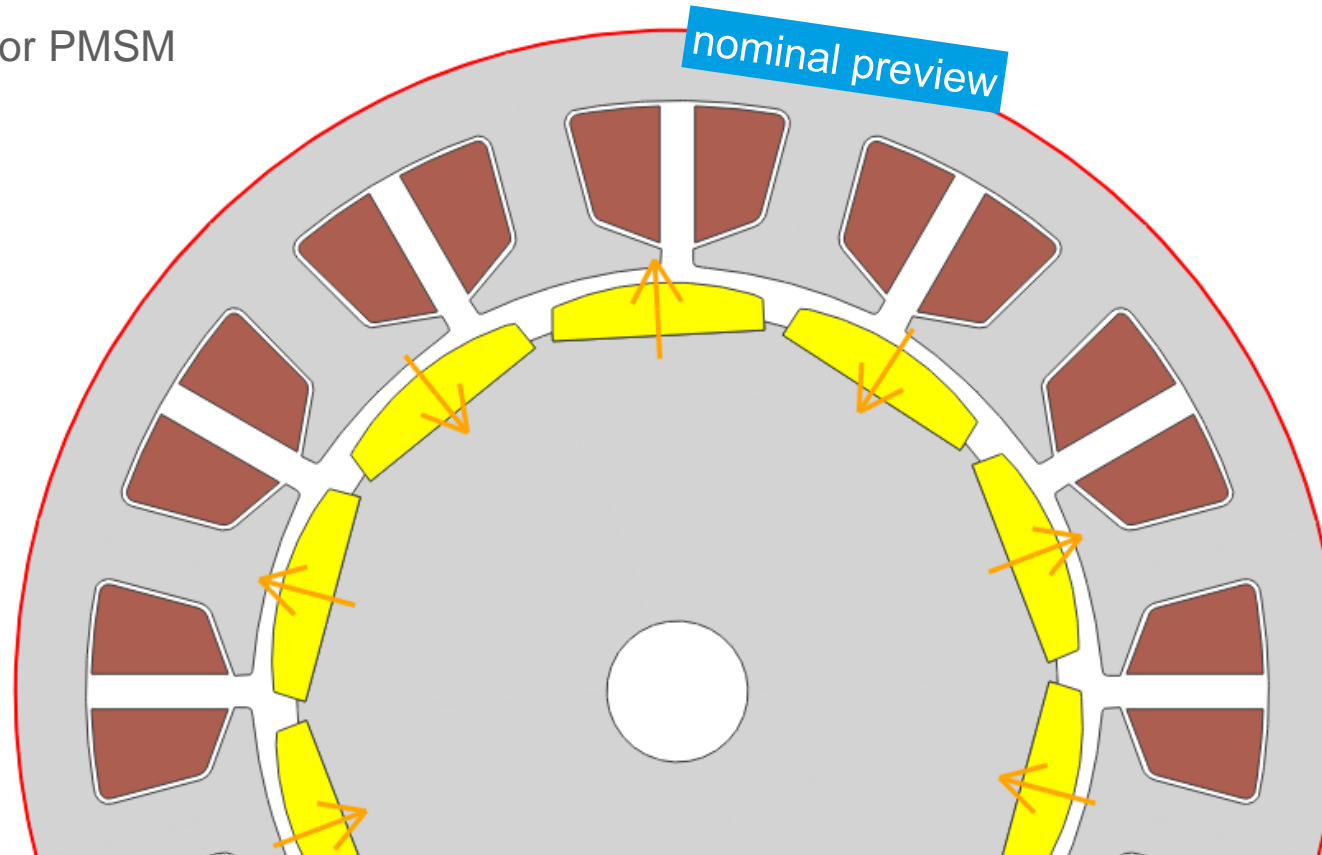
The main window is divided into two panes. The left pane, titled 'Structure', shows a tree view of the model components. The 'Slot' component is selected, and its properties are displayed in the right pane. The 'Imports' table in the right pane lists the variables and parameters imported from the model.

Variable	Parameter	OK
Ns	Ns	<input checked="" type="checkbox"/>
dso	dso	<input checked="" type="checkbox"/>
dsi	dsi	<input checked="" type="checkbox"/>
bst	bst	<input checked="" type="checkbox"/>
bsy	bsy	<input checked="" type="checkbox"/>
hss	hss	<input checked="" type="checkbox"/>
bss	bss	<input checked="" type="checkbox"/>
rs1	rs1	<input checked="" type="checkbox"/>
phis1	phis1	<input checked="" type="checkbox"/>
tsi	tsi	<input checked="" type="checkbox"/>
bsc	bsc	<input checked="" type="checkbox"/>
SingleLayer	Winding.SingleLayer	<input checked="" type="checkbox"/>
rs2	rs2	<input checked="" type="checkbox"/>
rs3	rs3	<input checked="" type="checkbox"/>
est	est	<input checked="" type="checkbox"/>
bst_tol	bst_tol	<input checked="" type="checkbox"/>
hss_tol	hss_tol	<input checked="" type="checkbox"/>
bss_tol	bss_tol	<input checked="" type="checkbox"/>
rs3_tol	rs3_tol	<input checked="" type="checkbox"/>
phis1_tol		<input type="checkbox"/>
est_tol	est_tol	<input checked="" type="checkbox"/>
Transformation	Transformation	<input checked="" type="checkbox"/>

# Tolerable Geometry Models

## Preview of a Geometry with Tolerances

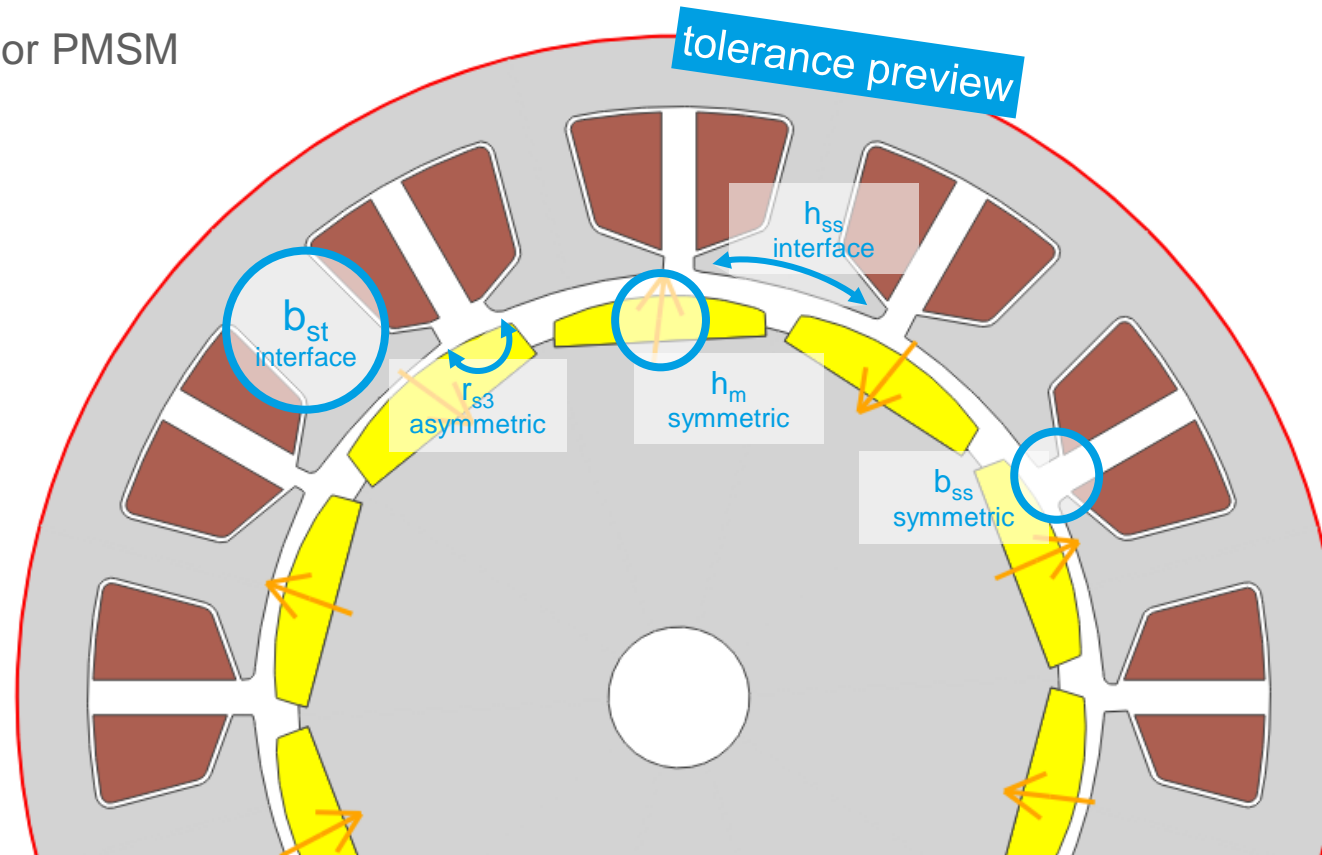
THERM2D preview of an interior PMSM without tolerances



# Tolerable Geometry Models

## Preview of a Geometry with Tolerances

THERM2D preview of an interior PMSM including tolerances



# Tolerable Geometry Models

## General Information

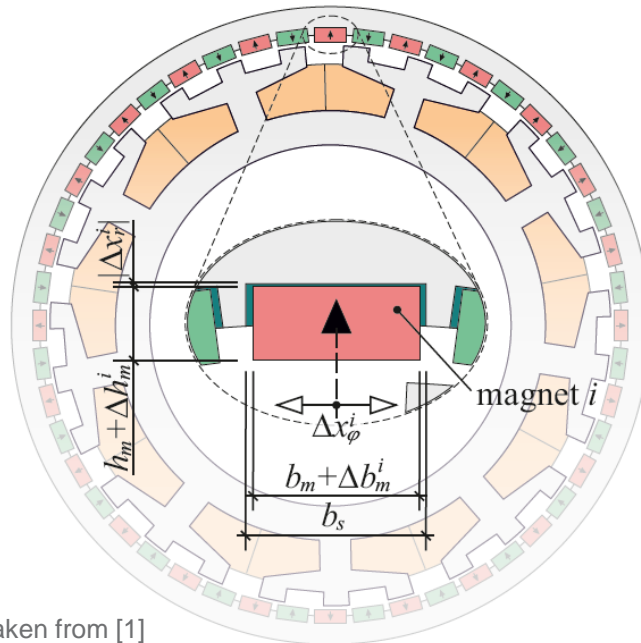
- Winding/Wire is placed within the nominal slot
  - as tolerances are small in general there should be no change to be expected for the coil layout
- Simulation settings need to be adapted
  - evaluation of the entire cross-section – no usage of symmetries possible
  - simulation time will be increased
- Intended to work seamlessly with the tolerance analysis python module – SymTolInterface

# Evaluation of a Tolerance Analysis



# Evaluation of a Tolerance Analysis

## The Problem ...

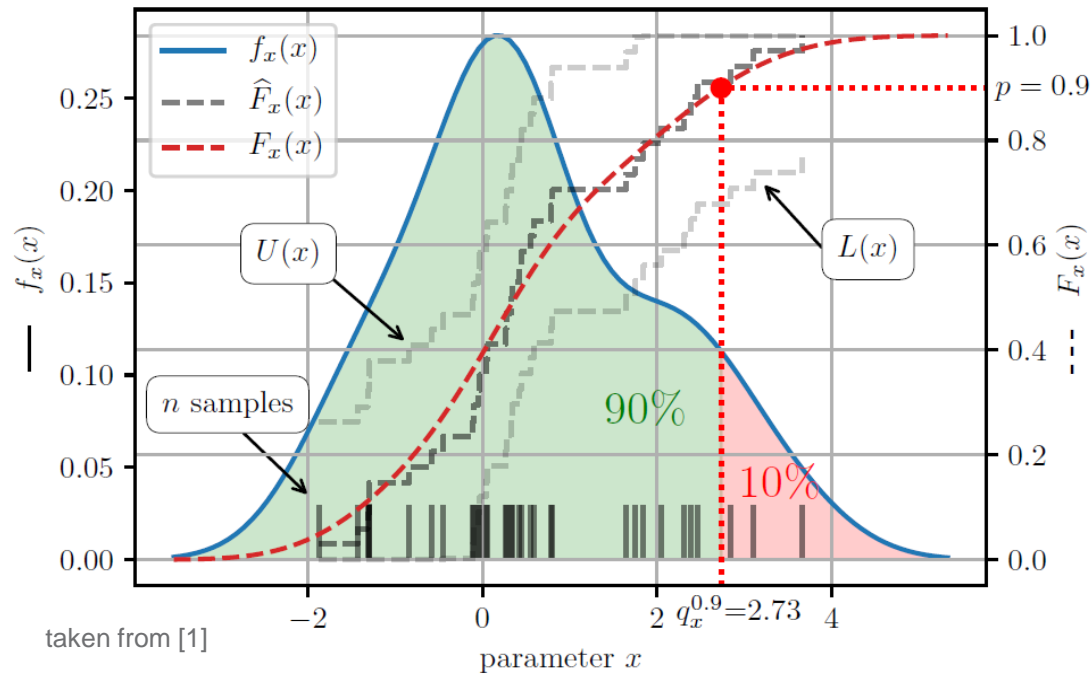


### Example: Vernier motor

- 4 tolerance-affected parameters per magnet
  - width
  - height
  - circumferential position
  - radial position
- 48 magnets
- assume 3 discretization steps per tolerance-affected parameter
  - $(3^4)^{48} = 3^{192} > 4 \cdot 10^{91}$  possible variations
- assume  $1 \mu s$  to calculate one variation
  - time to calculate all variations  $> 10^{78}$  years
  - symmetry conditions not taken into account ;-)

# Evaluation of a Tolerance Analysis

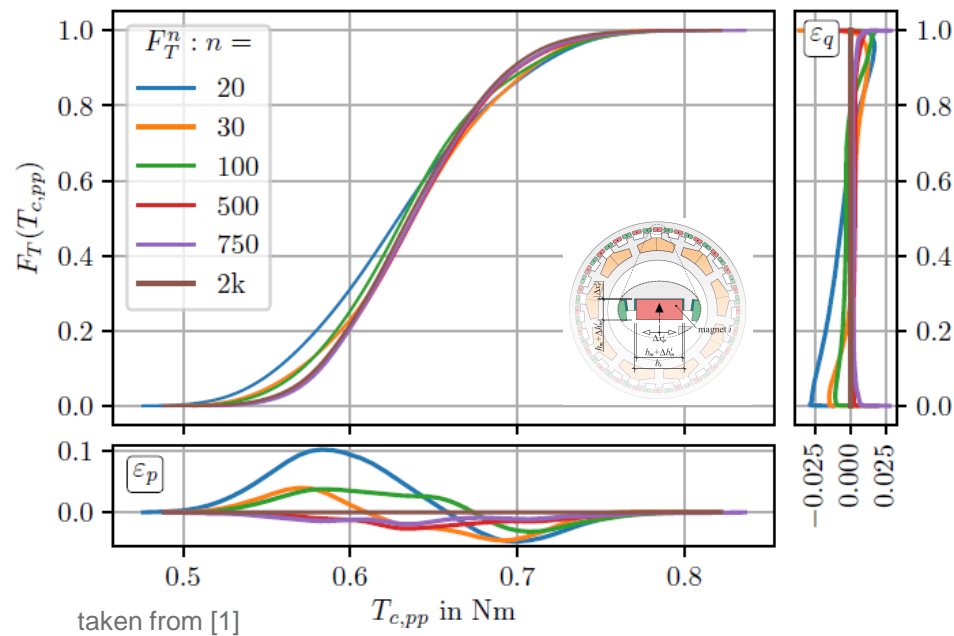
## Approach using CDF (Cumulative Distribution Function)



- $F_x$  cumulative distribution function
- $f_x$  probability density function
- $q_x^p$   $p$ -quantile value
- $p$  probability
- $L, U$  lower and upper confidence band

# Evaluation of a Tolerance Analysis

## Approach using CDF (Cumulative Distribution Function)



Example: Vernier motor

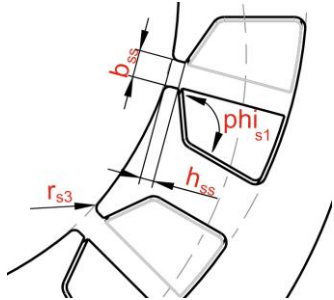
- + Convergence after 1000 samples!
- Worst Case most likely not covered

# Example

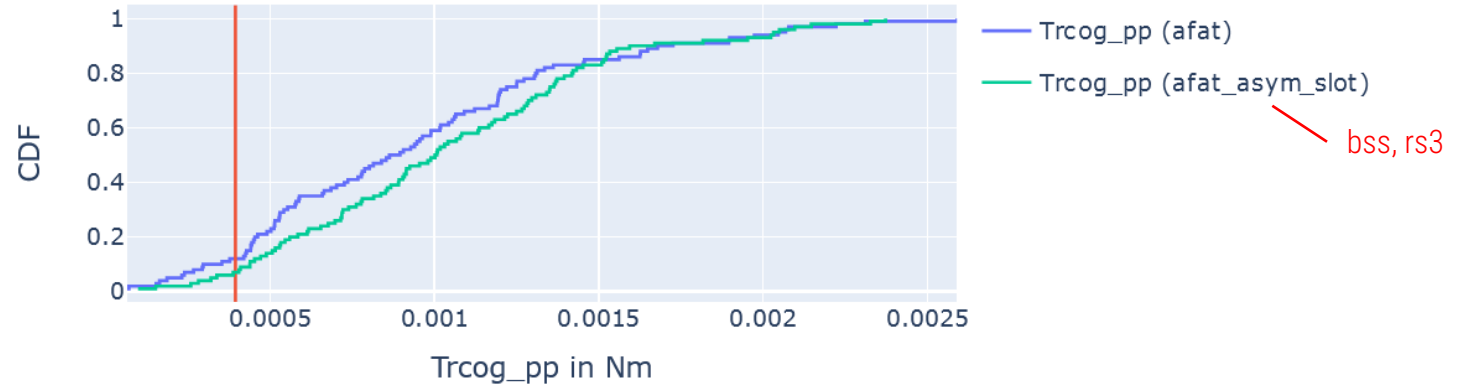
# Asymmetrical Stator Slot

## symmetric vs. asymmetric slot tolerances

Varying Parameters



Cumulative Distribution Function(s)



# Driving Range Sensitivity Analysis of a BEV

## Based on Car and Motor Model of Tesla3

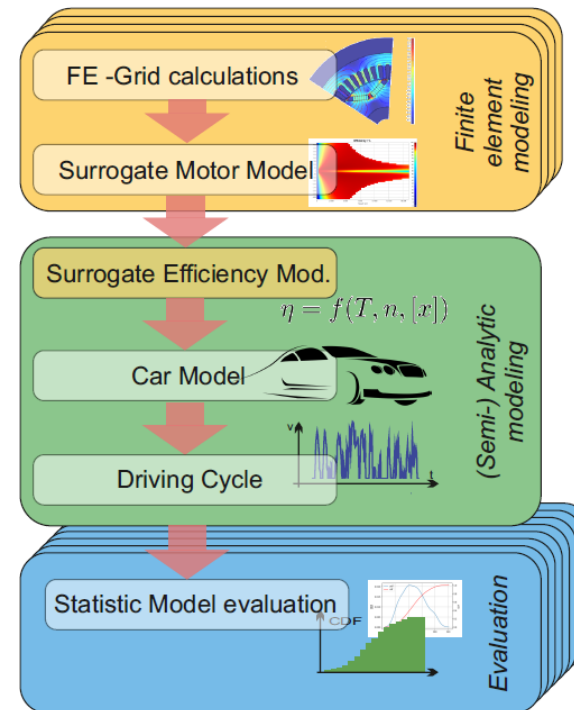
### Question

What's the influence of various system parameters on the driving range of a BEV?

### Varying Parameters

	Par.	[Unit]	Description
Motor Parameter	$B_r$	[T]	PM residual induction
	$d_{deg}$	[mm]	width of impacted zone regarding the material degrad.
Secondary Params	$\vartheta_{PM}$	[°C]	permanent magnets temperature
	$h$	[m]	altitude above sea level
	$\Delta_m$	[kg]	additional load
	$\eta_{pe}$	[-]	power electronics efficiency
	$\eta_{pt}$	[-]	powertrain efficiency

### Modeling in SyMSpace



### Scenario

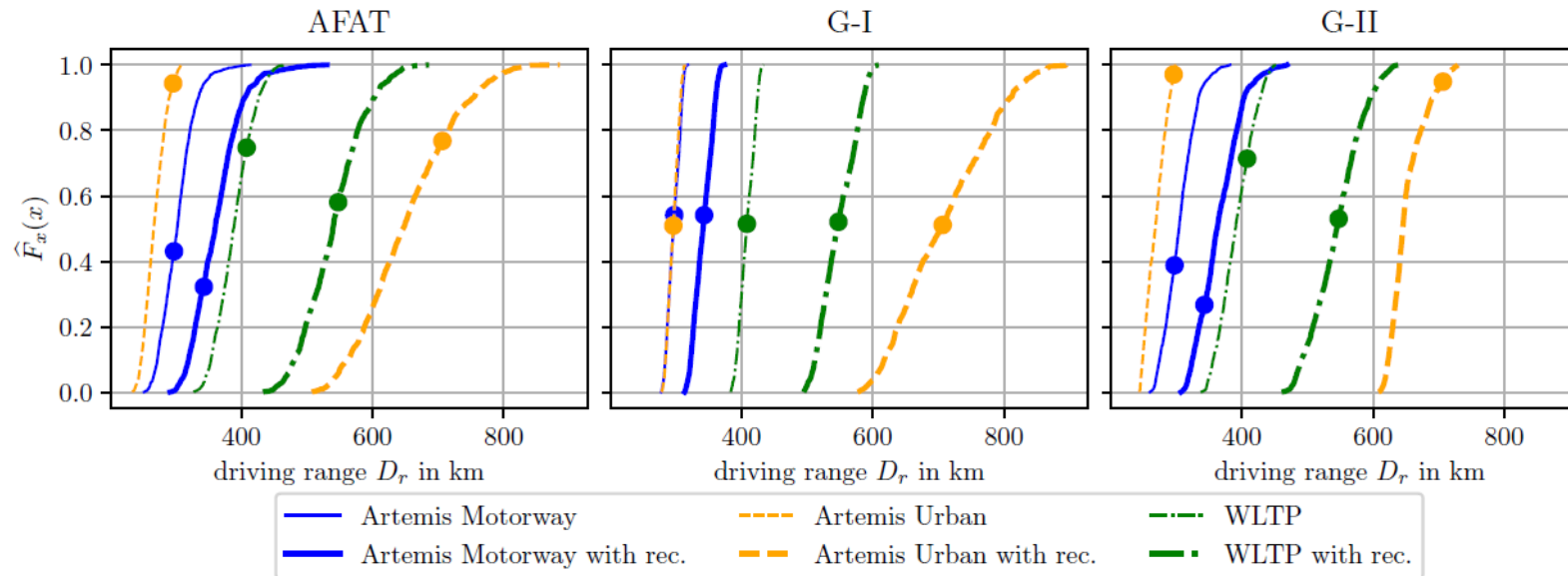
AFAT	all factors at a time
G-I	technical parameters
G-II	environmental parameters

### Sensitivity Analysis

# Driving Range Sensitivity Analysis of a BEV

## Based on Car and Motor Model of Tesla3

### Results



### Scenario

- AFAT all factors at a time
- G-I technical parameters
- G-II environmental parameters

# Robust optimization

## Outlook



# Robust Optimization

... incorporate sensitivity-objective in optimization

Even when using fast converging CDF evaluation, performing sensitivity analysis during e.g. genetic optimization (1000 additional samples per individual) takes too much time

Alternative methods, mainly using additional surrogate models, are under development

... meanwhile ...

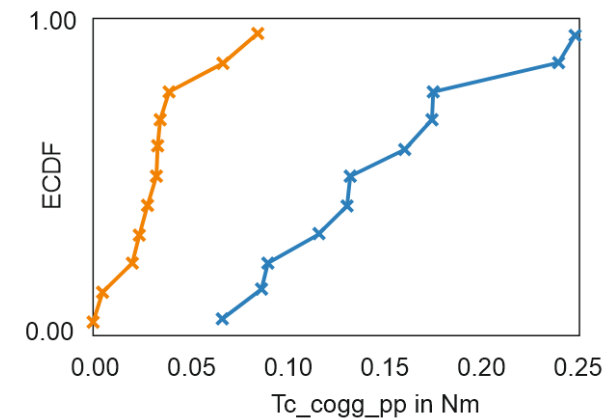
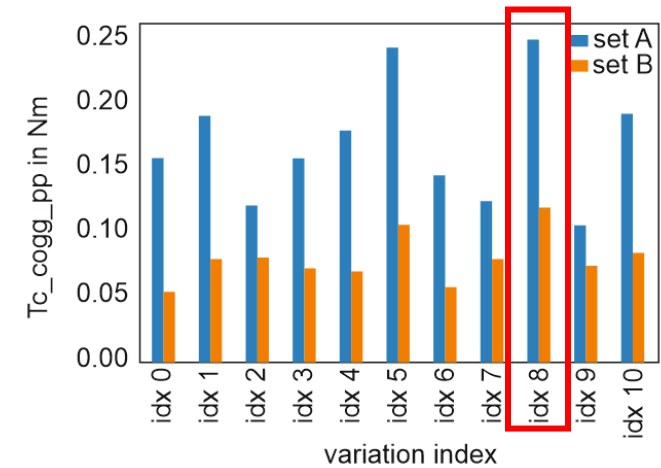
# Robust Optimization

## Simple Approach (Example: Magnetic Gear Optimization)

1. Evaluation of a set of tolerance-affected samples (set A) with randomly assigned tolerance values
2. Choose one of the bad samples and use this tolerance configuration for an optimization
3. Select Pareto optimal sample from optimization with “fixed” tolerance settings
4. Recalculate all sets from step 1. with selection of step 3. (set B)
5. compare CDFs

Approach might be used to at least take tolerance effects into account.

Of course, with this approach it is unlikely to find the most robust design!



# Closing the presentation

# Final summary

- Beta Version of Tolerance-Analysis-Workflow for SyMSpace available
- All segment geometries capable of tolerance analysis (with small changes to definition)
- Extensive documentation included for [SymTolInterface](#) python package
  - Ready to use within SyMSpace application (so far not working from WEB GUI)
  - **Caution: proper evaluation of subharmonic signal content has to be checked!**
- Projects welcome for further development and refinement of existing workflow

Thank you for your  
attention!

Science becomes  
**reality**

