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Multidisciplinary System Design Optimization (MSDO)

A General Aviation Aircraft Conceptual Design using Multidisciplinary Optimization

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Outline

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- Problem formulation
- Design space exploration
- Single objective SQP optimization
- Sensitivity analysis, scaling
- Genetic Algorithm optimization
- Multiobjective SQP optimization
- Conclusion



Project Definition

- Objective: design a general aviation aircraft in order to:
 - increase Range
 - decrease Gross Take-Off Weight (GTOWeight)
- Motivation: study the performance tradeoff
- Reference aircraft *Cessna 172R Skyhawk*:
 - used to validate the algorithm
 - used as a starting point for gradient-based algorithms



Master Table

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Variables	Description	Units	Min	Cessna (<i>real performances</i>)	Max
<i>WingArea</i>	Wing Area	[m ²]	0	16.2	-
<i>WingSpan</i>	Wing Span	[m]	0	11	20
<i>FuseLength</i>	Fuselage Length	[m]	3	8.28	20
<i>FuseDiameter</i>	Fuselage Diameter	[m]	1	1.22	4
<i>CruiseVel</i>	Cruise Velocity	[m/s]	0	62.78	-
<i>CruiseAlt</i>	Cruise Altitude	[m]	0	2438	6000
<i>Range</i>	Range	[km]		1218 (1074, +13.4%)	
<i>GTOWWeight</i>	Gross Take-Off Weight	[kg]		1309 (1111, +17.8%)	
<i>BendStress</i>	Wing Bending Stress	[MPa]			2000
<i>ARWing</i>	Wing Aspect Ratio	[]	5	7.47	
<i>FuseRatio</i>	Fuselage Ratio	[]	0.1	0.147	



Fixed Parameter Values

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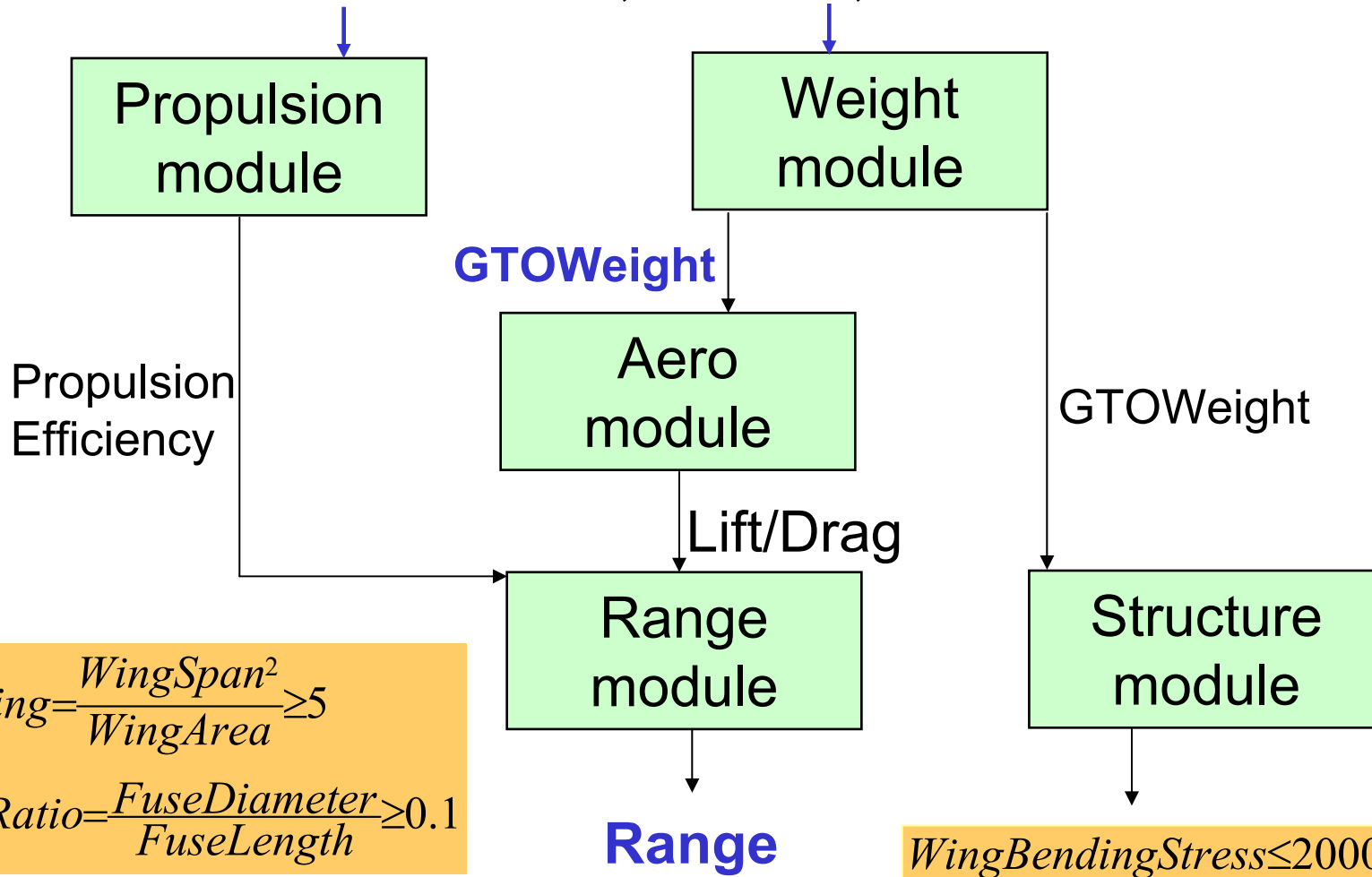
Fixed Parameters	Description	Units	Value
<i>EngPower</i>	Engine power	[W]	119312 (160 BHP)
<i>EngineWeight</i>	Engine weight	[kg]	70
<i>Sfc</i>	Specific fuel consumption	[m ⁻¹]	5.10 ⁻⁶
<i>FracPowerCruise</i>	Fraction of power used at cruise	[]	80%
<i>rotationvelocity</i>	Propeller rotation velocity	[rpm]	2400
<i>propellerdiameter</i>	Propeller blade diameter	[m]	1.91
<i>EngineNum</i>	Number of Engines	[]	1
<i>PayloadWeight</i>	Payload weight	[kg]	100
<i>PassNum</i>	Number of passengers	[]	2

Values of parameters: *Cessna 172R Skyhawk*



Simulation Modules

WingArea, WingSpan, FuseLength,
FuseDiameter, CruiseVel, CruiseAlt



$$AR_{Wing} = \frac{WingSpan^2}{WingArea} \geq 5$$

$$FuseRatio = \frac{FuseDiameter}{FuseLength} \geq 0.1$$

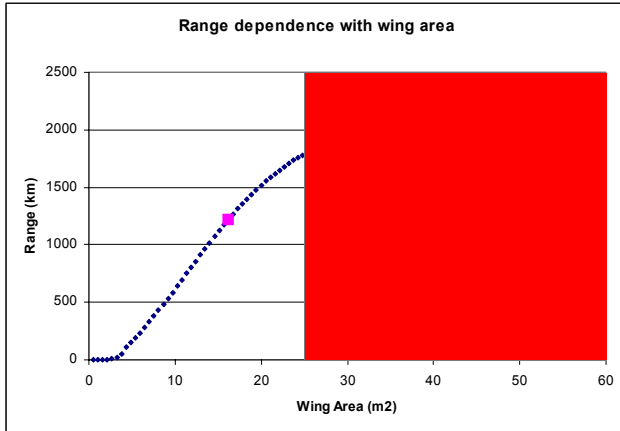
$$WingBendingStress \leq 2000 MPa$$



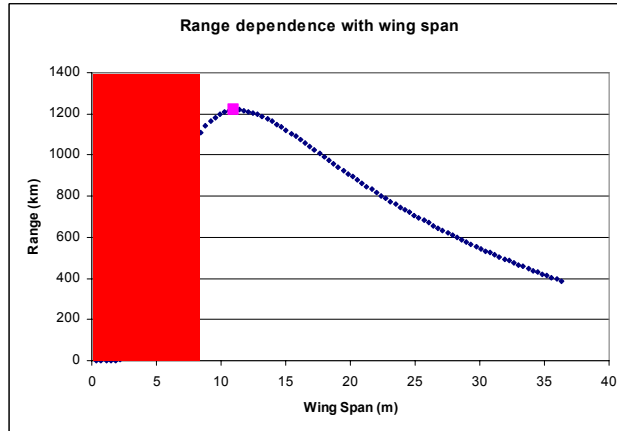
Design Space Exploration: Parameter Study of Range

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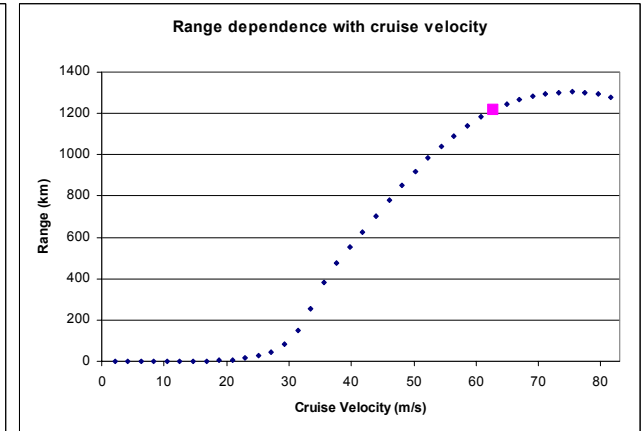
Wing Area



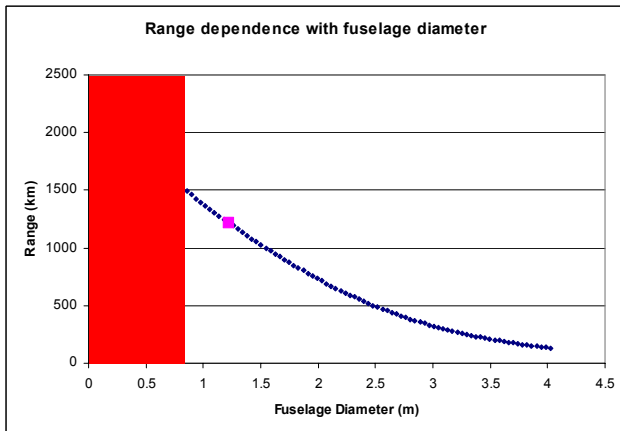
Wing Span



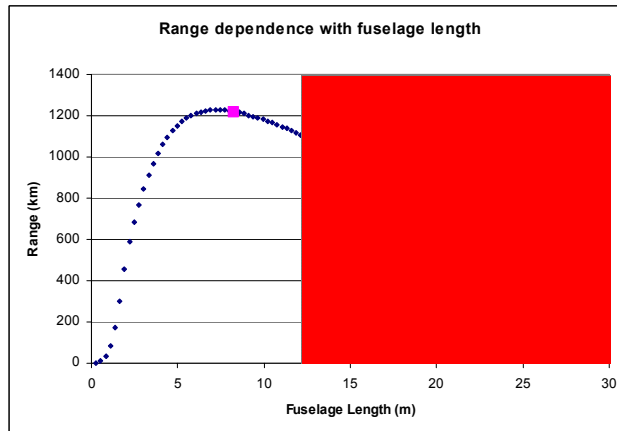
Cruise Velocity



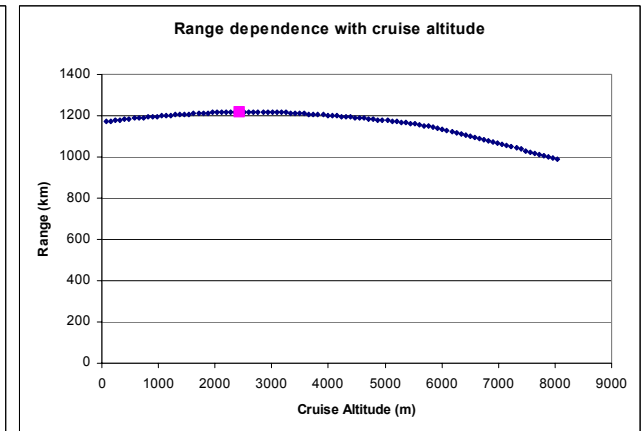
Fuselage Diameter



Fuselage Length



Cruise Altitude



■ *Cessna 172R Skyhawk*



Gradient-based iSIGHT SQP-NLPQL optimization results

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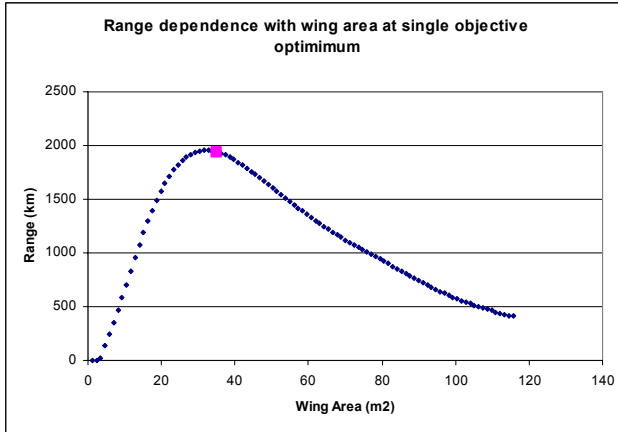
Variables	Units	Min	Cessna	Optimum	Max
<i>WingArea</i>	[m ²]	0	16.2	35.0	-
<i>WingSpan</i>	[m]	0	11	13.2	20
<i>FuseLength</i>	[m]	3.	8.28	5.74	20
<i>FuseDiameter</i>	[m]	1.0	1.22	1.0	4
<i>CruiseVel</i>	[m/s]	0	62.78	58.4	-
<i>CruiseAlt</i>	[m]	0	2438	2448	6000
<i>Range</i>	[km]		1218	1940	
<i>GTOWeight</i>	[kg]		1309	1829	
<i>BendStress</i>	[MPa]			2000	2000
<i>ARWing</i>	[]	5.0	7.47	5.0	
<i>FuseRatio</i>	[]	0.1	0.147	0.174	



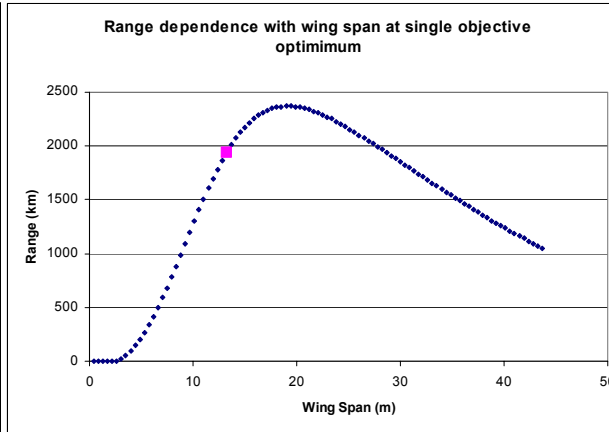
Reduced Sensitivity

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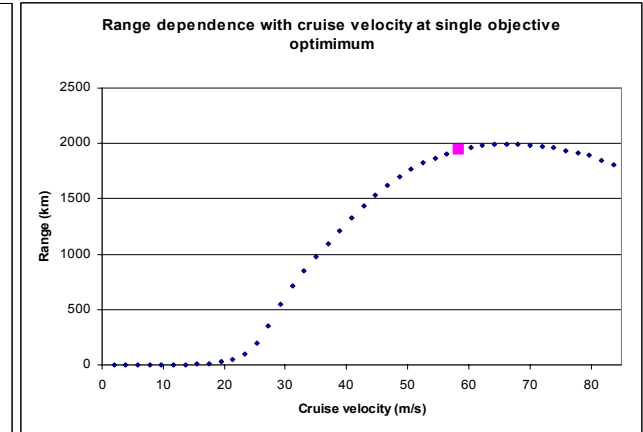
WingArea: -0.1775



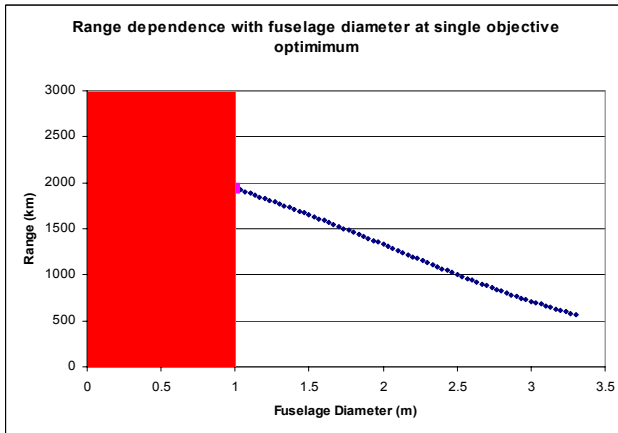
WingSpan: 1.1121



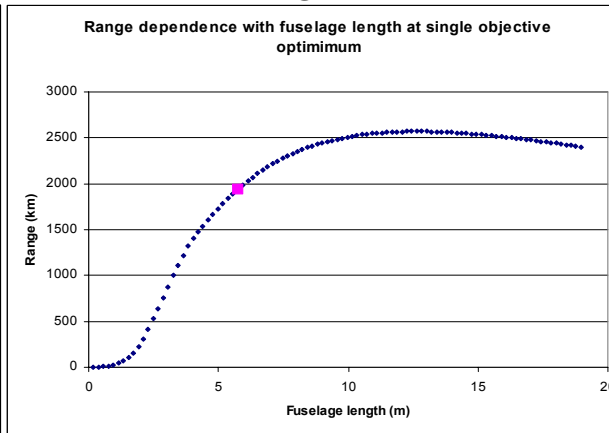
CruiseVelocity: 0.4353



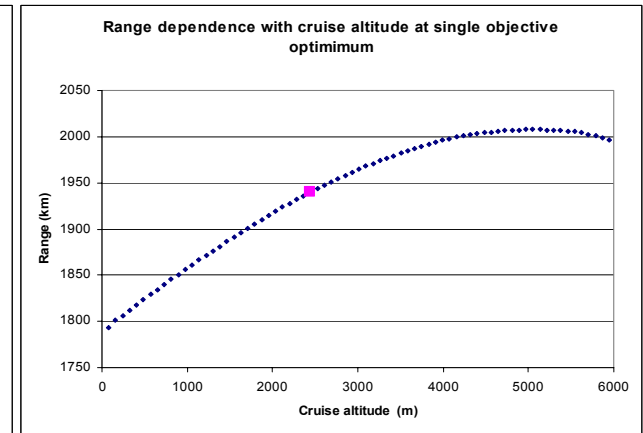
FuseDiameter: -0.2794



FuseLength: 0.7376



CruiseAlt: 0.0602



■ SQP optimum



Sensitivity - Constraint Relaxation

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<i>Variables</i>	Min	SQP Optimum	BendStress +25%	FuseDiameter -25%	ARWing -25%	Max
<i>WingArea</i>	0	35.0	62.22	35.05	106.5	-
<i>WingSpan</i>	0	13.2	17.64	13.25	20	20
<i>FuseLength</i>	3.	5.74	10	6.45	14.34	20
<i>FuseDiameter</i>	1	1.0	1.0	0.75	1.43	4
<i>CruiseVel</i>	0	58.4	64.97	58.4	73.3	-
<i>CruiseAlt</i>	0	2448	4693	2448	2450	6000
<i>Range</i>		1940	3664	2258	3905	
<i>GTOWeight</i>		1829	3384	1777	6925	
<i>BendStress</i>		2000	2500	2000	2000	2000
<i>ARWing</i>	5	5.0	5.0	5.0	3.75	
<i>FuseRatio</i>	0.1	0.174	0.1	0.116	0.1	



Single-Objective Scaling

- We evaluate the Hessian using finite differencing:

$$\frac{\partial^2 J}{\partial x_i^2}(x^*) = \frac{J(x_1, \dots, x_i + \delta x_i, \dots, x_n) - 2J(x_1, \dots, x_i, \dots, x_i, \dots, x_n) + J(x_1, \dots, x_i - \delta x_i, \dots, x_n)}{\delta x_i^2}$$

Original Hessian coefficients

$$\lambda_{WingArea} = -3.05$$

$$\lambda_{WingSpan} = -38.59$$

$$\lambda_{FuseLength} = -79.28$$

$$\lambda_{FuseDiameter} = -139.1$$

$$\lambda_{CruiseVelocity} = -1.564$$

$$\lambda_{CruiseAlt} = 0.0136$$

Scale factors

$$sf_{WingArea} = 1$$

$$sf_{WingSpan} = 10$$

$$sf_{FuseLength} = 10$$

$$sf_{FuseDiameter} = 10$$

$$sf_{CruiseVelocity} = 1$$

$$sf_{CruiseAlt} = 0.1$$

New Hessian coefficients

$$\lambda_{WingArea} = -3.05$$

$$\lambda_{WingSpan} = -0.386$$

$$\lambda_{FuseLength} = -0.773$$

$$\lambda_{FuseDiameter} = -1.378$$

$$\lambda_{CruiseVelocity} = -1.564$$

$$\lambda_{CruiseAlt} = 0.0045$$

157 iterations to reach optimum

54 iterations to reach optimum



Multi-island Genetic Algorithm results for 40 generations

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Population	SQP Optim	5 islands of 5	10 islands of 5	10 islands of 10	5 islands of 5	5 islands of 5
Mutation rate	-	0.01	0.01	0.01	0.001	0.1
Wing Area	35.0	21.03	63.39	73.68	58.22	19.61
Wing Span	13.2	10.33	15.97	16.93	16.48	10.10
Fuselage Length	5.74	3.63	14.00	17.22	4.42	3.84
Fuselage Diameter	1.0	2.73	1.05	1.02	1.37	3.98
Cruise Velocity	58.4	49.10	67.49	78.78	57.38	22.61
Cruise Altitude	2448	2579.58	5132.50	101.02	1089.86	5331.79
Range	1940	254.13	3821.96	5426.72	1326.00	3.68
Bending Stress	2000	1952.07	1862.45	1959.03	1883.36	1741.06
Wing Aspect Ratio	5.0	5.08	4.02	3.89	4.67	5.20
Fuselage Ratio	0.174	0.76	0.075	0.059	0.31	1.04



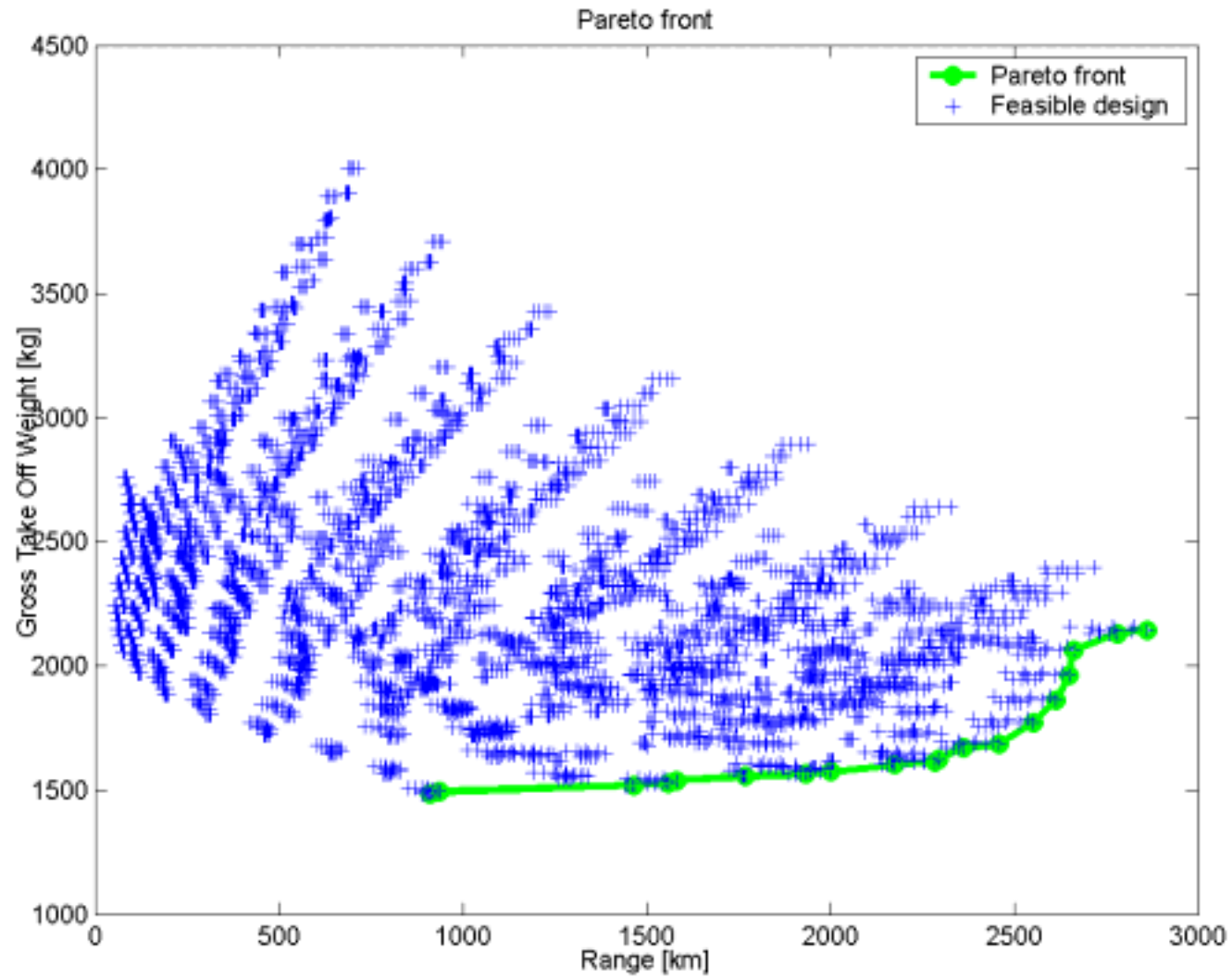
Multiobjective SQP Optimization

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Variables	Cessna	Optim	Case1	Case2	Case3	Case4	Case5
<i>RangeWeight</i>	-	1	2	2.25	2.50	1.50	1
<i>GTOWWeight</i>	-	0	1	1	1	1	2
<i>WingArea</i>	16.2	35.04	30.74	31.18	31.50	29.30	18.5
<i>WingSpan</i>	11	13.24	12.39	12.49	12.55	12.10	9.62
<i>FuseLength</i>	8.28	5.75	5.83	5.82	5.742	5.81	4.758
<i>FuseDiameter</i>	1.22	1.0	1.0	1.0	1.0	1.0	1.0
<i>CruiseVel</i>	62.78	58.37	61.24	61.03	62.36	62.13	63.03
<i>CruiseAlt</i>	2438	2445	2447	2445	2998	2447	2447
<i>Range</i>	1074	1940	1893	1902	1937	1858	1265
<i>GTOWWeight</i>	1111	1830	1655	1672	1686	1596	1156
<i>BendStress</i>		2000	2000	2000	2000	2000	2000
<i>ARWing</i>	7.47	5	5	5	5	5	5
<i>FuseRatio</i>	0.147	0.174	0.172	0.172	0.174	0.172	0.21



Pareto Front





Conclusions

- Single objective SQP optimization is successful. Scaling and sensitivity analysis are efficient.
- Because of the topology of the design space (too many infeasible designs), the GA approach failed.
- The multi-objective approach illustrates the importance of the weight factors, and is consistent with the real Cessna case.
- Future work:
 - A stability module could be added.
 - The knowledge of the topology of the feasible design space would be valuable.