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## Performance Analysis and Optimal Sizing of Electric Multirotors

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## Abstract

This paper presents an analytical framework for addressing the hovering performance of a battery–powered multirotor. The estimation of power required for flight is investigated and an analytical model is proposed to describe the rotor figure of merit as a function of few relevant blade parameters, without the need for ad hoc experiments. The model is derived after a discussion about the aerodynamics of rotating blades. The formulation in terms of Reynolds number is supported by an experimental campaign, performed on a set of commercial–of–the–shelf propellers optimized for small–scale multirotor applications.

By imposing the balance between required and available power, the hovering time is predicted by an integral formulation developed for a constant–power battery discharge process. The best endurance condition is obtained in terms of optimum battery capacity and flight time. The methodology, applicable to the design phase of novel multirotor configurations, is finally validated by flight tests.

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## 1 1. Introduction

Remotely-Piloted Aerial Systems (RPAS), particularly small batterypowered fixed and rotary-wing platforms, gained a large interest in the scientific community. Reduced size, weight, and operational costs, in fact, make such systems one of the most suitable solutions for a wide range of applications, including load transportation, search and rescue, risk management, surveillance, aero-photogrammetry, and, in general, remote sensing activities [1, 2].

Among the available rotary-wing configurations, multirotors proved to 9 be particularly attractive [3]. On the one hand, low structural complexity 10 and simplicity of use allow for operative cost reduction. On the other hand, 11 the hovering and vertical take-off and landing capabilities empower effec-12 tive operations in restricted and obstructed areas [4, 5]. Also, with respect 13 to a conventional helicopter with the same take-off weight, a multirotor is 14 typically characterized by a more compact size, with satisfactory robustness 15 to external disturbances and improved maneuvering capabilities [6, 7]. Such 16 features are achieved by spreading the total disc area into multiple propulsion 17 units, where the use of smaller propellers rotating at a higher speed comes at 18 the cost of a loss in efficiency with respect to the conventional, single-rotor 19 configuration. This, in addition to the limited endurance-to-weight ratio 20 typical of electrically-driven systems, makes the performance of the hover-21 ing condition a critical, but challenging, issue. In this respect, the larger 22 demand for high endurance RPAS operations, has increased the interest on 23 research programs which aim at deriving numerical and analytical tools for 24 range/endurance prediction and optimal preliminary sizing [8]. 25

Most of the available multirotor configurations use MH–Ni, Li–Po, and 1 Li–Ion battery packs. Due to their long life, small self–discharge, and high 2 energy-to-weight ratio, Li-Po and Li-Ion systems have become the most 3 widespread solution to power supply, provided a suitable Battery Manage-4 ment System (BMS) is designed to ensure safety and efficiency of battery 5 usage [9]. The basic functions of a BMS include battery data acquisition, 6 modeling and state estimation, charge and discharge control, fault diagnosis 7 and alarm, thermal management, balance control, and communication. Bat-8 tery modeling and state estimation are thus key functions of advanced BMS, 9 allowing for reliable operation of unmanned systems, optimize the battery 10 configuration, and provide a basis for safety management [10]. The battery 11 models presented in literature mainly fall into the following three categories: 12 a) physics-based electrochemical models [11], b) electrical equivalent circuit 13 models [12], and c) data-driven models established by artificial intelligence 14 algorithms such as neural networks or support vector machines [13]. With re-15 spect to the battery state estimation problem, different techniques have been 16 proposed in order to characterize the state-of-charge/state-of-energy. These 17 methods include a) the use of look-up tables, b) -hour integral routines, c) 18 recursive algorithms based on Kalman–like [14] or particle filter approaches, 19 d) state-observers, e) data-driven based methods, such as neural networks, 20 fuzzy-logic and genetic algorithms, support vector machines [15]. 21

Early studies investigating the performance and sizing of battery-powered aircraft became available only at the beginning of the last decade, based on Peukert's modeling of the discharge process [16]. In particular, numerical and analytical solutions addressing electric aircraft performance are presented

in [17], where the effects of absorbed current on residual battery capacity 1 are considered. In Ref. [18] the best range condition is discussed in detail 2 while in [19] endurance estimates are validated by means of an experimental 3 campaign. With regard to multirotor vehicles, a closed-form solution for en-4 durance analysis as well as an optimal sizing approach for the battery pack is 5 provided in [20], where the configuration for maximum endurance is outlined 6 in terms of rotorcraft design features and optimal battery capacity, after a 7 test-bed characterization of the powerplant. Lindahl et al. [21] propose a 8 sizing tool to select a good combination of propulsion components, based on a 9 linear approximation to the ohmic region of the battery discharge law. Using 10 momentum theory and blade element theory, Latorre [22] offers an optimal 11 design for the electric power system of a quadrotor using the identification 12 method, and proposes a mathematical model to select the optimal motor. 13 Kaya et al. [23] use a polynomial model to estimate the motor-propeller pair 14 performance (from the endurance point of view), based on collected test data 15 and under the assumption of constant current discharge. By introducing the 16 notions of available capacity and usable capacity factors, Abdilla et al. [24] 17 obtain an endurance formula model for rotorcraft driven by Li–Po batter-18 ies. The same authors finally propose a technique to optimize the endurance 19 of rotorcraft by sub-dividing the monolithic battery into multiple smaller-20 capacity batteries, which are then sequentially discharged and released [25]. 21

The above mentioned approaches, typically based on Peukert's equation, stem from the simplifying assumption of a constant-current discharge model. However, it must be noted that a constant-power battery discharge process is more representative of fixed-wing steady-level flight or hovering of batterypowered rotorcraft. To this aim, Fuller [26] developed a battery discharge
model, based on a modification of Peukert's law, to predict the terminal
voltage and current for a constant-power process. Finally, a novel constantpower integral formulation of battery discharge process was derived, based
on experimental data, in Ref. [27] by some of the present authors. This
model provides a complete framework for performance analysis and optimal
preliminary sizing of fixed-wing platforms.

In order to fully predict and optimize the performance of electric rotor-8 craft, however, battery modeling is only the starting point. The complete 9 propulsion system needs to be characterized, with particular attention to the 10 generation of thrust from selected propellers. In Ref. [28] the aerodynamic 11 efficiency of small-scale propellers is addressed also under non-axial inflow 12 conditions, whereas in [29] a mathematical model of the engine thrust/RPM 13 function for low Reynolds number applications is presented. With respect 14 to multirotor sizing, recent works address the problem by means of scaling 15 laws and similarity models [30], and by using a hybrid approach which in-16 tegrates theoretical formulations, computational fluid dynamics, and exper-17 imental validation [31, 32, 33]. Other approaches to the throttle/thrust and 18 thrust/power functions description are obtained by experimental validations 19 [34, 35], manufacturer data [36], or CFD analysis [37]. 20

In what follows, the total power required for the hovering condition is calculated according to the procedure presented in [38]. Then, in order to characterize the aerodynamic behavior of the propeller, an analytical model is proposed to describe the rotor figure of merit as a function of few relevant blade parameters. To this aim, results of the classical Blade Element (Mo-

mentum) Theory (BET) [39] are enhanced by introducing an empirical cor-1 rection function allowing for a more accurate prediction of the required blade 2 tip speed, for a given thrust condition. Following a similar approach, a semi-3 empirical expression of the figure of merit as a function of blade Reynolds 4 number [40] and propeller pitch/diameter ratio is finally derived. These re-5 sults are obtained thanks to a dedicated experimental campaign performed on 6 a selection of commercial-of-the-shelf propellers, optimized for small-scale 7 multirotor applications. At the cost of few simplifying assumptions, flight 8 endurance is analytically evaluated according to the battery model presented 9 in [27], adapted for the first time to the analysis of multirotor platforms. 10

Finally, such model is applied to prove the existence of an optimal battery 11 configuration (namely the configuration determining the maximum hovering 12 endurance). In fact, unlike conventional fuel-powered vehicles, where an 13 increased fuel fraction always provides increased endurance and range, the 14 weight of electrically-powered vehicles remains constant. Hence, the bene-15 ficial effect of weight loss during flight is not experienced [20]. In this case, 16 increasing battery weight may not necessarily provide an increased endurance 17 and/or range, if the energy cost of lifting more weight overcomes the bene-18 fit of the increased battery-pack capacity. Generally speaking, the solution 19 to the optimal sizing of battery packs is a challenging issue, which involves 20 different kinds of electric vehicles. Wang et al. [41] prove that the range-21 and energy-optimal design points can be considered concurrently in design 22 optimization of small electric aircraft: for a given flight task and performance 23 objective, the approach incorporating the dynamic battery model and static 24 component model provides an optimal flight trajectory and the correspond-25

ing battery package parameters. In [42] convex modeling steps are introduced 1 to simultaneously optimize battery sizing and energy management of hybrid 2 electric vehicle powertrains. An investigation is also provided where results 3 from convex optimization are compared to those obtained with dynamic pro-4 gramming. In [43] the joint optimization problem of battery mass and flight 5 trajectory for high-altitude solar-powered aircraft is discussed. In particu-6 lar, a Gauss pseudo-spectral method is employed to determine the minimal 7 power consumption while following the flight trajectory, and particle swarm 8 optimization is used to calculate the optimal battery mass. In the present 9 work, the optimal sizing problem is also discussed. Provided that the field 10 of applicability is restricted to the hovering flight condition of a prescribed 11 empty-operative platform, the discharge model presented in [27] is manip-12 ulated to provide the optimal battery capacity as an analytical function of 13 rotorcraft parameters and battery coefficients. Predictions from this model 14 are validated with a few test cases. 15

The major contribution of the present paper to multirotor aircraft state-16 of-the-art is the derivation of a fully analytical framework, based on a re-17 duced set of relevant design features, without the need of ad hoc laboratory 18 tests on power plant components and battery packs. Almost all the above 19 mentioned approaches to rotors' performance analysis are, in fact, based on 20 the experimental characterization of the entire propulsion chain (battery, 21 regulator, engine, propeller), with particular focus on aerodynamic analysis. 22 Thus, in order to obtain an accurate estimation of rotorcraft performance 23 as well as a suitable preliminary sizing, the actual power system needs to 24 be selected and available for laboratory test campaign. This makes such 25

approaches not applicable when the platform design process is at an early 1 conceptual stage and the power system selection is the main expected out-2 put. To the best of the authors' knowledge, an analytical procedure aimed 3 at accurately estimating the endurance and range of a multirotor platform 4 as a function of a reduced number of design parameters is still missing in 5 the literature. The scope of the present paper is thus to fill this gap by 6 proposing an analytical approach allowing for an accurate and physically 7 consistent estimation of multirotor hovering endurance, based on a limited 8 number of design features, propeller characteristics, and battery parameters. 9 In this respect, the derived closed-form expression for the figure of merit 10 allows for the following three main results: 1) rotorcraft accurate power and 11 endurance prediction at hover, 2) optimal endurance condition analysis, and 12 3) rotorcraft sizing by providing the optimal battery pack/take-off weight 13 ratio. 14

The paper is structured as follows. Sections 2 and 3 address the total power required for the hovering flight and the figure of merit characterization, respectively. The analytical framework for multirotor endurance prediction and optimal sizing procedure is derived in Section 4. Numerical simulations and experimental results validating the proposed technique are finally presented Section 5. A section of concluding remarks ends this paper.

### 21 2. Power Required at Hover

<sup>22</sup> Consider a multirotor with N identical electric motors and propellers, <sup>23</sup> the latter characterized by a number B of blades. A planar non-ducted non-<sup>24</sup> intermeshing configuration is analyzed where the thrust generated by each <sup>25</sup> rotor is aligned with the local vertical when the vehicle is at hover. Extension to a non-planar configuration is straightforward and can be obtained from
the analysis in [6].

<sup>3</sup> The total power required for flight,

$$P_r = P_s + P_h \tag{1}$$

is expressed as the sum of two main contributions [38], namely the power to be absorbed by onboard systems,  $P_s$ , and the power necessary for the 5 hovering condition,  $P_h$ . The former, allocated to avionics and payload, is 6 assumed to be approximately constant. The latter, related to the generation 7 of thrust, is calculated as  $P_h = N P_{sh}$ , where  $P_{sh} = P_{id}/f$  is the power 8 delivered by each electric motor to its rotor shaft, obtained by dividing the 9 ideal induced power  $P_{id}$  by the rotor figure of merit f < 1. Provided m 10 is the rotorcraft mass and g is the gravitational acceleration, let W = mg11 be the take-off weight. On the basis of momentum theory,  $P_{id} = T v_i$  is 12 obtained as the product between the thrust generated by the single rotor at 13 hover, T = W/N, and the induced speed  $v_i$ , assumed to be uniform on the 14 actuator disk. According to Glauert's hypothesis [44], the induced velocity 15 is expressed as a function of rotor thrust,  $v_i = \sqrt{T/(2 \rho A)}$ , where  $\rho$  is air 16 density,  $A = \pi R^2$  is rotor disc area, and R is rotor radius. The effect of the 17 rotor induced velocity on the airframe drag, which would be included in the 18 computation of  $P_h$ , is disregarded in the present framework. 19

The power output of the battery delivered to the propulsion system is reduced by losses within the electric driving system made of cables, electronic speed controllers (ESCs), and electric motors. Although each element has its own efficiency,  $\eta_c$ ,  $\eta_{esc}$ , and  $\eta_m$ , respectively, for the purpose of the present work they are combined into an overall electrical efficiency,  $\eta_e = \eta_c \eta_{esc} \eta_m$ , <sup>1</sup> such that

$$\eta_e(P_b - P_s) = P_h \tag{2}$$

where  $P_b$  is the total power produced by the battery pack(s). Taking into account Eq. (1) and the definition of  $P_h$ , the total power requested from the battery for the hovering flight becomes

$$P_b = P_s + N P_{id} / (f \eta_e) \tag{3}$$

Note that in a correctly sized propulsion system it is  $\eta_e \approx \eta_{esc} \eta_m$ , provided 5 that power losses in cables are typically negligible within the overall efficiency 6 analysis. On the converse, the system made of ESCs and motors represents 7 a significant source of inefficiency, with performance that is a function of 8 angular rate, torque, and applied voltage [45, 46]. In order to perform the 9 correct characterization of  $\eta_e$ , specifications are typically provided by sys-10 tem manufacturers, retrieved from online databases [47, 48], or determined 11 experimentally (see Section 5 for some applicative examples). 12

## 13 3. Figure of merit characterization

The figure of merit characterization is based on a detailed knowledge 14 of the aerodynamic coefficients, whose identification requires complex mea-15 surements or calculations. In the present framework, the figure of merit is 16 expressed as function of few propeller parameters that can be extracted ei-17 ther from the propeller datasheet or from simple measurements. Once this 18 expression is identified from basic theoretical considerations, the required 19 correction coefficients are identified that best predict the performance of a 20 class of standard propellers optimized for multirotor applications. 21

#### <sup>1</sup> 3.1. Blade-element theory analysis

<sup>2</sup> Let  $\Omega$  be the rotor angular rate, such that  $V_{tip} = \Omega R$  is blade tip speed, <sup>3</sup> and define the thrust coefficient,  $C_T = T/(\rho A V_{tip}^2)$ . The figure of merit, as <sup>4</sup> derived by BET and expressed as a function of  $C_T$ , is [39]:

$$f = \frac{\frac{C_T^{3/2}}{\sqrt{2}}}{\kappa_{ind} \frac{C_T^{3/2}}{\sqrt{2}} + \frac{\sigma C_d}{8}}$$
(4)

where  $\sigma = B \bar{c} / (\pi R)$  is rotor solidity (with B being the number of blades 5 and  $\bar{c}$  the blade mean aerodynamic chord),  $C_d$  is the airfoil drag coefficient 6 averaged along the blade, and  $\kappa_{ind}$  is the induced-power correction factor. 7 This coefficient is derived from rotor measurements or flight tests and it 8 encompasses a number of non ideal effects, including nonuniform inflow, tip 9 losses, wake swirl and contraction, blades interference, etc. Although  $\kappa_{ind}$ 10 depends on several blade parameters and is a function of  $C_T$  for a generic 11 lifting rotor [39], it must be noted that in typical small-scale multirotor 12 applications  $C_T$  has limited variability over the available throttle range (see 13 Fig. 3.a), especially at high rotational speed, where the design operating 14 point is typically located [49]. It follows that the resulting small fluctuations 15 of  $\kappa_{ind}$  have a limited impact on the figure of merit. Therefore, in the present 16 model  $\kappa_{ind}$  is fairly assumed as a constant. 17

<sup>18</sup> On the other hand, the term related to the profile losses has a larger <sup>19</sup> impact at small  $C_T$  values. Therefore, the attention is focused on the analysis <sup>20</sup> of the drag coefficient  $C_d$  and its detailed expression. To this end, define <sup>21</sup> Re =  $\rho c_{75} V_{75}/\mu$  as the Reynolds number conventionally evaluated at 75% <sup>22</sup> blade radius [40], where  $\mu$  is the dynamic viscosity of the air, while  $c_{75}$  and <sup>1</sup>  $V_{75} = \sqrt{v_i^2 + (0.75 \cdot V_{tip})^2}$  respectively represent the local airfoil chord and <sup>2</sup> the relative airspeed.

It is important to stress that in large-scale rotors a reasonable first assumption is to consider  $C_d = C_{d_0}$ , namely a constant independent from Reynolds number, being the flow fully turbulent. Instead, in small-scale rotors, the Reynolds number typically ranges between  $10^4-10^5$ , so that the flow can be assumed to be fully laminar [40] and  $C_d = C_d(\text{Re})$ . To find an expression for  $C_d$  the friction coefficient  $C_f$  can be expressed according to Blasius theory as [50]:

$$C_f = 1.328 / \sqrt{\text{Re}}.$$
(5)

Although Eq. (5) is derived for a flat-plate boundary layer at zero pressure
gradient, in this regime the expression

$$C_d = 2 C_f, \tag{6}$$

obtained considering both sides of the blade-section, results to be a reasonable estimate of the drag coefficient for an airfoil at low angle of attack [51]. Therefore Eq. (6) is implemented in the present model to describe Reynolds number effects on the profile losses. On the other hand, effects such has boundary layer growth and separation are neglected under the assumption that each section of the considered blade is purposely designed to work at a limited angle of attack during a hovering condition.

In order to characterize the local blade air flow, the blade tip speed (and, hence,  $C_T$ ) needs be estimated for a given thrust condition. According to linearized aerodynamic theory, the local 2–D blade lift coefficient is written as  $C_l = C_{l\alpha} (\alpha - \alpha_0) = C_{l\alpha} (\theta - \alpha_0 - \phi)$ , where  $C_{l\alpha}$  is the slope of the 2–D lift

coefficient,  $\alpha_0$  is the corresponding zero–lift angle,  $\theta$  is the pitch angle, and  $\phi$ 1 is the relative inflow angle at a generic airfoil section due to the induced flow. 2 Although  $C_{l\alpha}$  and  $\alpha_0$  may vary according to the local airfoil characteristics 3 and flow conditions, an average value for both parameters, constant along 4 the blade, is considered. Furthermore, define y as the radial distance from 5 the rotational axis and r = y/R as the non-dimensional location along the 6 blade, such that r = 0 at the rotor hub and r = 1 at the tip. In this 7 framework, rotor blades are modeled with a linear twist, such that the pitch 8 angle takes the form  $\theta(r) = \theta_0 + r \theta_{tw}$ , where  $\theta_0$  is the pitch angle value ideally 9 extrapolated to r = 0 and  $\theta_{tw}$  is the total blade twist angle (tip minus root 10 pitch angle). In Ref. [39] it is shown that, if the reference blade pitch angle 11 (here defined as  $\theta_{75}$ ) is taken at r = 0.75, then  $\theta(r) = \theta_{75} + (r - 0.75)\theta_{tw}$  and 12

$$C_T = \frac{1}{2}\sigma C_{l\alpha} \left(\frac{\theta_{75} - \alpha_0}{3} - \frac{\lambda}{2}\right) \tag{7}$$

<sup>13</sup> where  $\lambda = v_i/V_{tip}$  is rotor inflow ratio. Taking into account Eq. (7) and <sup>14</sup> rewriting the thrust coefficient as  $C_T = 2 (v_i/V_{tip})^2$ , it follows:

$$2\left(\frac{v_i}{V_{tip}}\right)^2 = \frac{1}{2}\sigma C_{l\alpha} \left(\frac{\theta_{75} - \alpha_0}{3} - \frac{v_i}{2V_{tip}}\right)$$
(8)

15 that can be arranged to give

$$2 \sigma C_{l\alpha} \left(\theta_{75} - \alpha_0\right) V_{tip}^2 - 3 \sigma C_{l\alpha} v_i V_{tip} - 24 v_i^2 = 0 \tag{9}$$

<sup>16</sup> Assuming  $V_{tip}$  as the unknown variable, two real distinct solutions are pro-<sup>17</sup> vided by Eq. (9). After excluding the negative one, the required tip speed, <sup>18</sup> obtained by BET, results to be a function of the induced velocity  $v_i$  as

$$V_{tip}^{BET} = k_{tip} \, v_i \tag{10}$$

1 where

$$k_{tip} = \frac{1}{4} \left( \frac{1 + \sqrt{1 + \frac{64}{\sigma C_{l\alpha}} \theta_{75}/3}}{\theta_{75}/3} \right)$$
(11)

<sup>2</sup> is obtained by embedding, for simplicity,  $\alpha_0$  into  $\theta_{75}$  for profile sections with <sup>3</sup> low mean-camber line curvature. Finally,  $\theta_{75}$  is estimated as

$$\theta_{75} = \arctan\left(\frac{\Gamma}{0.75 \cdot \pi D}\right) \tag{12}$$

<sup>4</sup> where Γ is nominal blade advance pitch, provided by the manufacturer, that
<sup>5</sup> indicates the distance traveled by the propeller in one turn in the absence of
<sup>6</sup> slip [52].

By putting together Eqs. (10), (11), and (12), the thrust coefficient in
Eq. (7) becomes:

$$C_T = \sigma \pi \left( \frac{4\Gamma}{9\pi D} - \frac{1}{2k_{tip}} \right)$$
(13)

• where it is assumed  $C_{l\alpha} = 2 \pi \text{ rad}^{-1}$  and  $\theta_{75} \approx \Gamma/(0.75 \cdot \pi D)$ .

The combination of Eqs. (4), (5), and (13) highlights that, under the 10 assumptions made, the figure of merit nominally depends on two main non-11 dimensional parameters, namely  $\Gamma/D$  and Re. A third parameter is repre-12 sented by the solidity ratio  $\sigma$ . However, in typical multirotor applications, 13  $\sigma$  is found to have a limited variability, with average values in the order of 14 0.1 for two-bladed configurations [36]. Therefore, in this framework f is 15 considered as a function of two non-dimensional parameters only. The goal 16 is to find an analytical function  $H = H(f, \Gamma/D, \operatorname{Re}) = f(\Gamma/D)^{\alpha} \operatorname{Re}^{\beta}$  that 17 smoothly fits the experimental data. The appropriate choice of  $\alpha$  and  $\beta$  will 18 be made on the basis of an iterative procedure that minimizes the order of 19 the polynomial needed to fit the data (as it will be shown in Section 3.2.2). 20

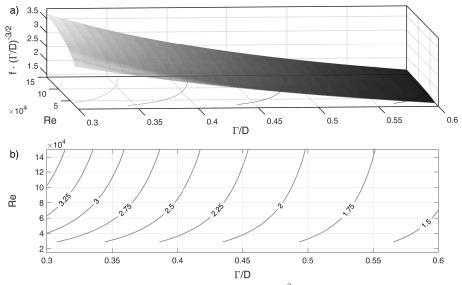


Figure 1: The non-dimensional function  $f (\Gamma/D)^{\alpha} \operatorname{Re}^{\beta}$  as obtained by Eqs. (4), (5), and (13)  $(\alpha = -3/2, \beta = 0)$ .

As an example, Fig. 1 shows that for  $\alpha = -3/2$  and  $\beta = 0$ , H is a 1 smooth function of  $\Gamma/D$  and Re. Following Eqs. (4), (5), and (13), the 2 Reynolds number is calculated in standard conditions for a rotation rate  $\Omega$ 3 in the range 100 - 800 rad/s. A reference configuration is considered with 4 diameter D = 15 in, the value of  $\sigma$  is selected as 0.1, and a constant value 5 of  $\kappa_{ind} = 1.25$  is assumed without loss of generality. As the plot shows, the 6 figure of merit increases monotonically with Re. This is a consequence of 7 the monotonic decrease of the drag coefficient with Reynolds number in the 8 range considered here. However, it has to be pointed out that the model in 9 Eq. (10) implies a constant inflow-ratio, with the result that  $C_T$  in Eq. (13) 10 does not vary with thrust, for a given value of  $\Gamma/D$ . Conversely,  $C_T$  may vary 11 as the Reynolds number increases, due to the increase in angular velocity. 12 This produces a decay of the figure of merit above a certain critical value of 13

Re, as a consequence of non-ideal flow conditions. This and other effects will
be accounted for in the next section, where the ideal model introduced above
is re-discussed with the contribution of experimental correction factors.

## 4 3.2. Enhanced blade characterization

The general expression for *f* obtained by Eqs. (4), (5), and (13) is useful to determine the relevant parameters needed to fully describe the figure of merit of a typical multirotor blade. However, this expression is obtained with strong assumptions on the blade and inflow characteristics, such as profile curvature, blade twist configuration, induced velocity distribution, and, in general, all the hypotheses at the base of BET (including the blade spanwise-averaging of aerodynamic properties).

To compensate for these effects, correction factors need to be experimentally determined and introduced in the modeling approach. In this regard, an experimental campaign is conducted with details provided in what follows. All tests are performed on a set of commercial-of-the-shelf propellers, selected on the basis of the following assumption:

Assumption 1 Static thrust is generated by a two-bladed propeller (B = 2)specifically designed for multirotor applications. It is assumed that  $0.3 \leq \Gamma/D \leq 0.6$  and  $D \leq 16$  in.

#### 20 3.2.1. Experimental setup

A total of 9 different propellers, depicted in Figure 2, is selected with characteristics detailed in Table 1.

For each propeller, a static thrust test is performed by a propulsion system made of a T-Motor T40A ESC and a T-Motor Antigravity 4006 KV380 brushless motor. The unit is mounted on a RCbenchmark Series 1585 thrust

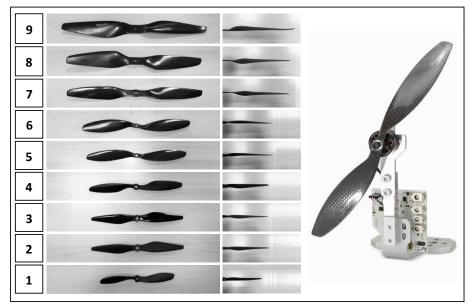


Figure 2: The sample propellers (planform and side views) and a detail of the thrust stand.

stand tailored to small and medium size drone optimization analysis. The
test bench supports thrust and torque measurement up to 5 kgf and 1.5 Nm,
respectively, and an optical RPM probe for propeller angular rate estimation.
The load cells are temperature-compensated and a preliminary calibration
procedure allows for accurate measurements over the full operating range.
Electrical power required for the propulsion system is delivered by a laboratory power supply stabilized at 24 V DC.

<sup>8</sup> Each experiment is conducted at room temperature  $\tau = 24$  °C and static <sup>9</sup> pressure  $p = 100\,877$  Pa, with estimated air density  $\rho = 1.1827$  kg/m<sup>3</sup> and <sup>10</sup> air dynamic viscosity  $\mu = 18.32 \cdot 10^{-6}$  Pa s. Provided that the control signal <sup>11</sup> is obtained by pulse-width modulation (PWM), the throttle command is <sup>12</sup> progressively incremented from 1000 to 1800, respectively generating zero and <sup>13</sup> maximum thrust, with steady-state measurements taken at intervals of 100.

|   | Propeller        | Finish | Material            | D [in] | $\Gamma$ [in] | $\bar{c} \; [\mathrm{mm}]$ | $c_{75}  [{\rm mm}]$ |
|---|------------------|--------|---------------------|--------|---------------|----------------------------|----------------------|
| 1 | DJI 0845         | polish | CFRN                | 8      | 4.5           | 17.6                       | 21                   |
| 2 | DJI 1038         | polish | CFRN                | 10     | 3.8           | 21.5                       | 18                   |
| 3 | DJI 1038S        | glossy | CFRN                | 10     | 3.8           | 21.5                       | 18                   |
| 4 | DJI 1045         | polish | CFRN                | 10     | 4.5           | 22.0                       | 24                   |
| 5 | HobbyKing 1147   | glossy | $\operatorname{CF}$ | 11     | 4.7           | 25.3                       | 29                   |
| 6 | HobbyKing 1238   | glossy | $\operatorname{CF}$ | 12     | 3.8           | 28.4                       | 31                   |
| 7 | RC Timer 1555    | glossy | $\operatorname{CF}$ | 15     | 5.5           | 29.3                       | 30                   |
| 8 | RC Timer $1555C$ | glossy | $\operatorname{CF}$ | 15     | 5.5           | 34.2                       | 30                   |
| 9 | RC Timer $1655$  | glossy | $\operatorname{CF}$ | 16     | 5.5           | 33.7                       | 31                   |

Table 1: Relevant data of tested propellers (CF: carbon fiber, CFRN: carbon fiber reinforced nylon).

<sup>1</sup> For each propeller, the test is repeated 3 times in the same conditions and <sup>2</sup> collected data are used to derive a single averaged curve for each measured <sup>3</sup> quantity. In Figure 3 the results obtained for propellers 5 and 7 are reported <sup>4</sup> as an example, showing the measured thrust coefficient  $C_T$ , torque Q, and <sup>5</sup> angular rate  $\Omega$  as a function of PWM command.

## <sup>6</sup> 3.2.2. Experimental results and fitting parameters

<sup>7</sup> One important aspect of the model derived in Eq. (10) is that of constant <sup>8</sup> inflow ratio. This implies a constant value of  $C_T$  for a given value of  $\Gamma/D$ . As <sup>9</sup> mentioned above, this is not verified in practice. Hence, it is first needed to <sup>10</sup> introduce in the proposed model a correction factor that allows for a variation <sup>11</sup> of the inflow-ratio with  $V_{tip}$ .

<sup>12</sup> Let  $\xi$  be a correction factor to the theoretically estimated tip speed  $V_{tip}^{BET}$ <sup>13</sup> in Eq. (10), such that  $V_{tip} = \xi V_{tip}^{BET}$ , where  $V_{tip}$  is obtained by direct mea-<sup>14</sup> surement. In Figure 4 the non-dimensional quantity  $g \triangleq \xi \cdot (\Gamma/D)^2 / \sigma$  is <sup>15</sup> plotted as a function of  $\Gamma/D$  and the induced speed  $v_i$  for all  $V_{tip}^{BET} \neq 0$ . The

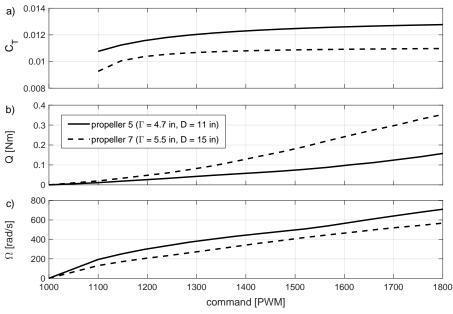


Figure 3: Measurements obtained for propellers 5 and 7.

mathematical form of g, which provides a weight equal to  $(\Gamma/D)^2/\sigma$  to the 1 correction factor  $\xi$ , is chosen after an iterative procedure aiming at a smooth 2 distribution of experimental data. Data points in Figure 4.a are fitted by the 3 surface  $G(\Gamma/D, v_i) = [v_1 + v_2 (\Gamma/D)^q] (v_3 + v_4 v_i^r)$ , parametrized by coeffi-4 cients  $v_1 = -9.144 \cdot 10^{-2}$ ,  $v_2 = 2.599$ ,  $v_3 = 2.525$ ,  $v_4 = 7.784 \cdot 10^{-1}$ , q = 1.757, 5  $r = -5.831 \cdot 10^{-1}$ , with root mean square residual equal to 0.054. Taking 6 into account the definition of g, the formulation of the bivariate function 7  $G(\Gamma/D, v_i)$  and the preliminary estimation obtained by BET in Eqs. (10)– 8 (12), it is  $\xi \approx \sigma G/(\Gamma/D)^2$  and the corrected estimate,  $\hat{V}_{tip}$ , of tip speed is 9 finally written as: 10

$$\hat{V}_{tip}(v_i) = \xi \, V_{tip}^{BET} = \frac{k_{tip} \, \sigma}{\left(\Gamma/D\right)^2} \left[ v_1 + v_2 \left(\Gamma/D\right)^q \right] \left( v_3 + v_4 \, v_i^r \right) v_i. \tag{14}$$

After characterizing the blade local flow condition, Eq. (4) is discussed on an experimental basis. For each test, the figure of merit is calculated as

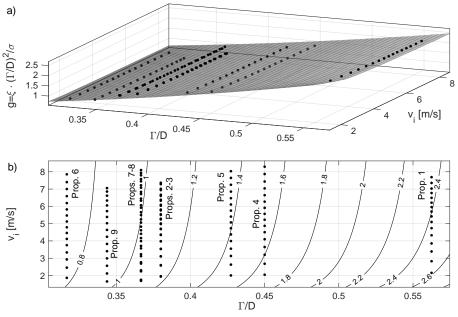


Figure 4: The non-dimensional function g for the complete set of propellers: a) measured data points and fitting surface; b) contour plot with corresponding iso-response lines.

 $f = P_{id}/P_{sh}$ , according to the definition given in Section 2, provided  $P_{sh} =$  $Q\Omega$  is derived from the product between the measured torque Q and the 2 angular rate  $\Omega$ . Based on experimental results, the non-dimensional quantity 3  $h \triangleq f \cdot (\Gamma/D)^{\alpha}$ , defined in Section 3.1, is plotted in Figure 5 as a function of 4  $\Gamma/D$  and the Reynolds number Re, with the fitting parameters selected as  $\alpha = -2$  and  $\beta = 0$ . Data points in Figure 5.a are fitted by a second-order polynomial surface, represented by the bivariate function  $H(\Gamma/D, \text{Re}) =$  $f_{00} + f_{10} (\Gamma/D) + f_{01} \operatorname{Re} + f_{20} (\Gamma/D)^2 + f_{11} (\Gamma/D) \operatorname{Re} + f_{02} \operatorname{Re}^2$ , with coefficients 8  $f_{00} = 17.03, f_{10} = -56.28, f_{20} = 50.61, f_{01} = 5.19 \cdot 10^{-5}, f_{11} = -6.034 \cdot 10^{-5},$  $f_{02} = -1.033 \cdot 10^{-10}$ , and root mean square error residual equal to 0.072. 10 Taking into account the definition of h and the formulation adopted for 11  $H(\Gamma/D, \text{Re})$ , it follows that the estimated figure of merit,  $\hat{f}$ , is expressed as 12

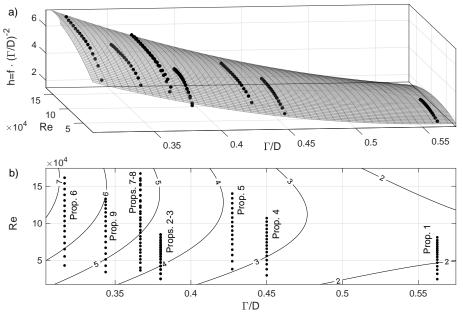


Figure 5: The non-dimensional function h for the complete set of propellers: a) measured data points and fitting surface; b) contour plot with corresponding iso-response lines.

#### <sup>1</sup> a function of Reynolds number according to the model

$$\hat{f}(\text{Re}) = f_0 + f_1 \,\text{Re} + f_2 \,\text{Re}^2$$
 (15)

<sup>2</sup> where

$$f_0 = (\Gamma/D)^2 \left[ f_{00} + f_{10} \left( \Gamma/D \right) + f_{20} \left( \Gamma/D \right)^2 \right]$$
(16)

3

4

$$f_1 = (\Gamma/D)^2 [f_{01} + f_{11} (\Gamma/D)]$$
(17)

$$f_2 = (\Gamma/D)^2 f_{02}$$
 (18)

Remark 1. The results derived in terms of figure of merit characterization and tip speed estimation are valid under Assumption 1, characterizing
a particular class of propellers. In what follows, the field of applicability
is discussed. First of all, commercial-off-the-shelf components are considered, optimized for multirotor vehicles. Then, the hobby and recreational

<sup>1</sup> applications are excluded, where the use of very small propellers (D < 8<sup>2</sup> in, often tri/four-bladed) is widespread and determines high-agility racing <sup>3</sup> capabilities, thanks to the lower rotor inertia and small blade pitch angle.

With regard to professional applications, where the focus is posed on sta-4 bility and endurance capabilities, it is interesting to note where the most im-5 portant drone and propellers manufacturers targeted the market. In Table 2, 6 for example, the complete multirotor fleets of some of the main professional 7 drone companies are listed, with relevant data characterizing the maximum 8 take-off mass (MTOM) and the adopted propellers for 18 different products 9 [53, 54, 55]. The applications range from aerial photography and videography, 10 3D mapping, surveying, and environment monitoring, to precision farming 11 and crop spraying. Taking a look at the types of propellers, it can be noted 12 that 15 samples are characterized by  $0.3 \leq \Gamma/D \leq 0.6$  and 9 of these have 13 a diameter D < 16. The result is that 50% of all the considered platforms 14 satisfy the requirements in Assumption 1 (the same percentage increases to 15 100% for multirotors with  $MTOM \leq 6$  kg). In addition to the analysis of 16 existing vehicles, it is interesting to investigate how the spare market of mul-17 tirotor components is structured, provided that the design of novel platforms 18 typically requires a wide spectrum of available propeller configurations. 19

To this aim, the complete catalogs of two of the biggest propellers manufacturers/resellers was dissected [56, 57]. In particular, a total of 89 propellers was investigated, characterized by a different diameter, pitch, material, finish, and blade shape. Results are reported in Figure 6. It can be noted that 78% of propellers satisfies the constraint on rotor diameter (D < 16 in) while 93% complies with  $0.3 \leq \Gamma/D \leq 0.6$ . Summarizing, 71% of collected samples

| Multirotor      | Multirotor MTOW [kg] |   | В             | $\Gamma$ [in] | D [in] | $\Gamma/D$ |
|-----------------|----------------------|---|---------------|---------------|--------|------------|
| DJI             |                      |   |               |               |        |            |
| Mavic Mini 2    | 0.242                | 4 | $2\mathbf{F}$ | 2.6           | 4.7    | 0.553      |
| Mavic Air 2     | 0.570                | 4 | $2\mathbf{F}$ | 3.8           | 7.2    | 0.528      |
| Mavic 2         | 0.906                | 4 | $2\mathbf{F}$ | 4.3           | 8.7    | 0.494      |
| Phantom 4 PRO   | 1.388                | 4 | 2             | 5.5           | 9.4    | 0.585      |
| Inspire 2       | 4.250                | 4 | 2             | 5             | 15     | 0.333      |
| S800 EVO        | 8                    | 6 | $2\mathbf{F}$ | 5.2           | 15     | 0.347      |
| S1000           | 11                   | 8 | $2\mathbf{F}$ | 5.2           | 15     | 0.347      |
| Matrice 200 V2  | 6.140                | 4 | 2             | 6             | 17     | 0.353      |
| Matrice 300 RTK | 9                    | 4 | $2\mathbf{F}$ | 10            | 21     | 0.476      |
| Matrice 600 PRO | 15.5                 | 6 | $2\mathbf{F}$ | 7             | 21     | 0.333      |
| MG-1P           | 24.5                 | 8 | $2\mathbf{F}$ | 7             | 21     | 0.333      |
| AGRAS T16       | 42                   | 6 | $2\mathbf{F}$ | 9             | 33     | 0.273      |
| AGRAS T20       | 47.5                 | 6 | $2\mathbf{F}$ | 9             | 33     | 0.273      |
| Freefly Systems |                      |   |               |               |        |            |
| Astro           | 8.382                | 4 | $2\mathbf{F}$ | 7             | 21     | 0.333      |
| Alta-8          | 18.1                 | 8 | $2\mathbf{F}$ | 6             | 18     | 0.333      |
| Alta–X          | 34.86                | 4 | $2\mathbf{F}$ | 9             | 33     | 0.273      |
| Yuneec          |                      |   |               |               |        |            |
| Typhoon H520    | 1.633                | 6 | 2             | 5.7           | 9.8    | 0.582      |
| Typhoon H3      | 2                    | 6 | 2             | 5.7           | 9.8    | 0.582      |

Table 2: DJI, Freefly, and Yuneec multirotors with relevant data (the symbol 'F' in the fourth column is related to foldable blade configurations).

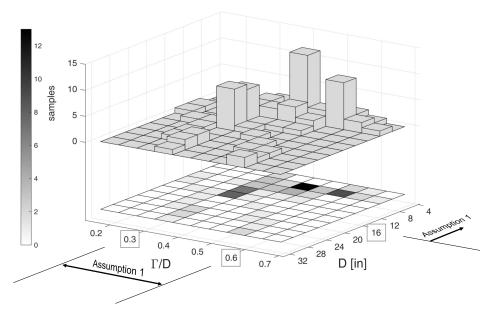


Figure 6: Bivariate histogram analysis of RC Timer and T–Motor propellers for professional multirotor applications.

<sup>1</sup> falls under the requirements of Assumption 1.

It is thus shown that the proposed approach fits a wide applicability 2 range, provided that the considered class of propellers is a reference for cus-3 tomized or off-the-shelf small-scale platforms. On the other hand, it must 4 be noted that such a market trend is also representative of all the cases where 5 high lifting capabilities are required but thrust is preferably distributed into 6 a higher number of smaller rotors. Despite the inherent increase of ideal 7 induced power, the adoption of such configurations is widespread and allows 8 1) the design of compact platforms, 2) the reduction of eventual damages 9 caused by blade impacts, 3) a higher degree of residual controllability after 10 failure of one or more propulsive units, and 4) reduced sensitivity to external 11 disturbances. In this respect, electrical and mechanical performance data for 12 a comprehensive range of motor and propeller combinations are reported in 13

<sup>1</sup> [36], with a detailed statistical analysis.

#### <sup>2</sup> 4. Performance analysis and optimization

#### 3 4.1. Hover endurance prediction

<sup>4</sup> Consider the expression obtained in Eq. (3) and note that, for a multirotor <sup>5</sup> in a hovering condition, battery power is a constant. In Ref. [27] a novel <sup>6</sup> formulation for constant-power battery discharge process is proposed, where <sup>7</sup> discharge time is expressed as a function of discharged capacity and absorbed <sup>8</sup> power. Let I = I(t) be the current provided by the battery pack at time t<sup>9</sup> and C = C(t) be the discharged capacity, obtained as

$$C(t) = \int_0^t I(s) \, ds \tag{19}$$

Provided  $P_b > 0$ , the discharge process is stopped at time  $t_f$  when  $C_f = C(t_f) = K C_0$ , with  $C_0$  equal to the nominal battery capacity and K < 1being a predefined discharge percentage. Discharge time is expressed in the form

$$t_f = \delta P_b^{\epsilon} C_f^{\beta} \tag{20}$$

where coefficients  $\delta > 0$ ,  $\epsilon < -1$ , and  $0 < \beta < 1$ , which depend on battery technology, ambient temperature, and number of series-connected cells, are determined experimentally. Conversely, when power is delivered by Li–Po battery packs and no equipment is available to perform ad hoc battery tests, the analytical results derived in [27] can be adopted, especially at a preliminary design stage. In particular, let  $N_s$  be the number of series-connected cells and define  $\delta_0$ ,  $\epsilon_0$ , and  $\beta_0$  as battery coefficients at the reference ambient temperature,  $\tau_0 = 23$  °C. It is:

$$\delta_0(N_s) = -0.1067 N_s^3 + 0.8960 N_s^2 + 2.488 N_s + 0.6299$$

$$\epsilon_0(N_s) = 2.917 \cdot 10^{-4} N_s^3 - 1.375 \cdot 10^{-3} N_s^2 + 3.083 \cdot 10^{-3} N_s - 1.041$$
(22)

while  $\beta_0 = 0.9664$ . In general, the parameters that define the variation of  $\delta_0$ 1 and  $\epsilon_0$  as a function of  $N_s$  depend on battery technology and aging. With 2 this in mind, it is pointed out that the experiments at the base of Eqs. (21)3 and (22) were performed on battery packs with exactly the same technology, 4 at approximately half of their operational lifespan, as a compromise between 5 better performance (when the battery pack is new) and degraded conditions. 6 Of course, an accurate estimate of discharge time would require to repeat 7 the whole experimental campaign at various stages of battery life, in order 8 to estimate the updated parameters and the effective capacity as battery 9 aging and degradation develop. This can be performed according to the 10 procedure in [27] by means of an electronic load or by collecting flight data 11 in terms of both hour-integral discharged capacity and delivered power, for 12 different loading conditions. Anyway, to the authors' experience with Li–Po 13 batteries, the trends of  $\delta_0(N_s)$  and  $\epsilon_0(N_s)$  are correctly evaluated, with only 14 minor variations. 15

In Ref. [27] an experiment was also conducted to investigate the effect of environment temperature on battery performance. In the present framework, the analyzed trend is extrapolated by assuming a linear regression, based on the available experimental data respectively obtained at 23 °C and at a lower temperature, namely 17 °C. Provided  $\Delta \tau = \tau - \tau_0$  is the temperature variation with respect to the reference case, the environment–compensated battery parameters are expressed as a function of  $N_s$  and  $\Delta \tau$  as

$$\delta(N_s, \Delta \tau) = \delta_0(N_s) \left(1 - c_1 \Delta \tau\right) \tag{23}$$

$$\epsilon(N_s, \,\Delta\tau) = \epsilon_0(N_s) \left(1 - c_2 \,\Delta\tau\right) \tag{24}$$

$$\beta(\Delta\tau) = \beta_0 \left(1 - c_3 \,\Delta\tau\right) \tag{25}$$

- <sup>1</sup> where  $c_1 = 0.0046 \ 1/^{\circ}$ C,  $c_2 = 0.0024 \ 1/^{\circ}$ C, and  $c_3 = 0.0011 \ 1/^{\circ}$ C are correc-
- <sup>2</sup> tion coefficients.

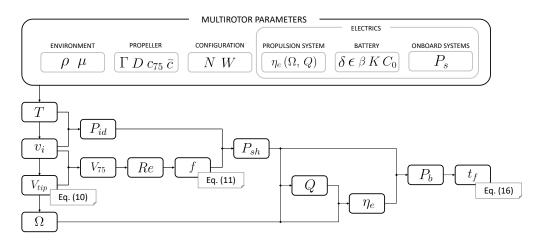


Figure 7: The proposed procedure to estimate battery power and flight time for a multirotor at hover.

In Figure 7 the complete procedure necessary to estimate the hovering 3 flight time for a given multirotor configuration is detailed. The set of pa-4 rameters that are required to be measured or estimated a priori are reported 5 at the top of the same figure. For a given take-off weight and multirotor 6 configuration, the required thrust T of the single rotor is used to derive the 7 induced speed  $v_i$  and the corresponding ideal induced power  $P_{id}$ . By Eq. (14) 8 one estimates the corrected blade tip speed and the Reynolds number at 75%9 blade radius, such that the figure of merit can be calculated according to the 10

experimental model in Eqs. (15)–(18). Given the ideal power  $P_{id}$ , corrected by the figure of merit to the shaft power  $P_{sh}$ , it is possible to characterize the torque  $Q = P_{sh}/\Omega$  applied by the electric motor to its rotor and the efficiency  $\eta_e$  of the electric propulsion system at that operating point. As a final step, the total battery power is derived as in Eq. (3), provided the power necessary for onboard systems  $P_s$  is known. The hovering time follows from Eq. (20) for a prescribed percentage of the nominal battery capacity  $C_0$ , in the considered environmental conditions.

## 9 4.2. Sizing of battery capacity

In this section, the optimal value of the battery capacity that maximizes hover endurance is determined, following an approach similar to that described in [20], where the optimal battery pack configuration was obtained by using the classical Peukert discharge model. For the aim of the present analysis, the total take-off weight is conveniently decomposed into

$$W = W_b + W_0 \tag{26}$$

where  $W_b$  is the battery weight and  $W_0$  is the operative empty weight made of contributions from: a) the frame (structure and rigging), b) the propulsive system (motors, electronic speed controllers, and propellers), c) the avionics (autopilot and communication system), and d) the eventual payload equipments. Let  $\chi = W_b/E_0 = W_b/(\mathcal{V}_0 C_0)$  indicate the nominal battery weight/energy ratio (that is, the inverse of battery energy density), such that the aircraft total weight in Eq. (26) can be rewritten as

$$W = W_0 + \chi \,\mathcal{V}_0 \,C_0 \tag{27}$$

<sup>1</sup> where  $\mathcal{V}_0$  is battery nominal voltage. Rotorcraft sizing is thus performed <sup>2</sup> assuming take-off weight W as the independent variable in Eqs. (3) and <sup>3</sup> (14), and determining battery capacity from Eq. (27),

$$C_0 = \frac{W - W_0}{\chi \,\mathcal{V}_0} \tag{28}$$

Given a predefined discharge percentage  $K \leq 1$ , flight endurance is thus sestimated according to Eq. (20) as a function of take-off weight W and, hence, of rated capacity  $C_0$ .

The necessary condition for the optimal value of W which maximizes the hovering flight time  $t_f$  (that is, the best endurance weight configuration, 8  $W = W_{be}$  is obtained by solving the equation  $dt_f/dW = 0$ . The sign 9 of the first derivative before and after its zeros (or, equivalently, the sign 10 of the second derivative at the zeros) allows for identifying maxima and 11 minima of the endurance curve. Despite the analytical formulation derived 12 in Section 3 for the figure of merit characterization, it is clear that, in the most 13 general case, the propulsive system efficiency  $\eta_e$  is a function of the estimated 14 rotor angular rate  $\Omega$  and applied torque Q, which is estimated from vehicle 15 datasheet or determined experimentally. Hence, an analytical solution for 16 the equation  $dt_f/dW = 0$  (and the sign of  $d^2t_f/dW^2$ ) with general validity is 17 not available. An iterative root search algorithm, such as Newton–Raphson 18 scheme [58], needs to be implemented and the second derivative at the zero 19 can be evaluated by means of centered differences. As an alternative, the 20 function that relates W to the expected performance in Eq. (20) can be 21 plotted and the best weight configuration identified either graphically on the 22 plot or numerically by means of a search algorithm, such as the parabolic 23 search or the simplex method [59]. 24

An approximate closed–form solution,  $W_{be}^{\star}$ , to the optimal sizing problem 1 can be made available on the basis of the following simplifying assumptions: 2 1)  $\eta_e$  is a constant; 2) the power required for avionics and payload is negligible 3 with respect to the power delivered to the propulsion system, namely  $P_s \ll$ 4  $N P_{sh}$ ; 3) the required blade tip speed is simply estimated on the basis of 5 BET according to Eq. (10), where  $V_{tip}^{BET} = k_{tip} v_i$ , with no correction; 4) the 6 effect of induced flow on local blade airspeed computation is disregarded, that 7 is to say  $v_i \ll 0.75 \cdot V_{tip}$  and  $V_{75} \approx 0.75 \cdot V_{tip}$ ; 5) an ideal battery is considered 8 where discharge time is obtained by Eq. (20) with  $\epsilon = -1$  and  $\beta = 1$ . Taking 9 into account the assumptions given above, the expression  $dt_f/dW$  results to 10 be proportional to a fourth order polynomial and  $dt_f/dW = 0$  if 11

$$q_0 + q_1 y + q_2 y^2 + q_4 y^4 = 0 (29)$$

where  $y = \sqrt{W}$  and

$$q_0 = 96\,\mu^2 f_0 A N W_0 \tag{30}$$

$$q_1 = 24 \,\mu \, c_{75} \, f_1 \, k_{tip} \, W_0 \sqrt{2 \,\rho \, A \, N} \tag{31}$$

$$q_2 = 9 c_{75}^2 f_2 k_{tip}^2 W_0 - 32 \mu^2 f_0 A N$$
(32)

$$q_4 = 9 c_{75}^2 f_2 k_{tip}^2 \tag{33}$$

<sup>12</sup> are constant coefficients. Based on Eqs. (16)–(18), it is  $f_0$ ,  $f_1 > 0$  and  $f_2 < 0$ <sup>13</sup> for all propellers selected under Assumption 1, with the result that  $q_0 > 0$ , <sup>14</sup>  $q_1 > 0$ ,  $q_2 < 0$ , and  $q_4 < 0$ . The sequence of signs in Eq. (29) is thus ++--, <sup>15</sup> which indicates that, according to Descartes' rule [60], there is only one real <sup>16</sup> positive solution, in the form:

$$W_{be}^{\star} = y_{be}^{\star 2} = \left(S + \frac{1}{2}\sqrt{-4S^2 - \frac{2q_2}{q_4} - \frac{q_1}{q_4S}}\right)^2 \tag{34}$$

where

$$S = \frac{1}{2}\sqrt{-\frac{2q_2}{3q_4} + \frac{1}{3q_4}\left(Q + \frac{\Delta_0}{Q}\right)}$$
(35)

$$Q = \sqrt[3]{\frac{\Delta_1 + \sqrt{\Delta_1^2 - 4\,\Delta_0^3}}{2}} \tag{36}$$

$$\Delta_0 = q_2^2 + 12 \, q_4 \, q_0 \tag{37}$$

$$\Delta_1 = 2 q_2^3 + 27 q_4 q_1^2 - 72 q_4 q_2 q_0 \tag{38}$$

Provided that the polynomial in Eq. (29) grows towards  $-\infty$  as  $y \to +\infty$ , the first derivative is expected to be positive before the root and negative after it, thus indicating that the zero of the first derivative corresponds to a maximum for  $t_f$ . Finally, the optimal value of the battery capacity that maximizes hover endurance is obtained from Eq. (28) with  $W = W_{be}^{\star}$ .

## <sup>6</sup> 5. Results

The proposed technique, developed to estimate the hovering performance 7 of multirotor platforms and to provide battery-sizing guidelines, is numer-8 ically validated. In particular, a comparison is provided between model-9 predicted data and the results of flight tests, in terms of required battery 10 power and hovering endurance. Flight data are provided by the rotorcraft 11 manufacturers (see configurations MR1, MR2, and MR3) or are obtained 12 from a dedicated experimental campaign, performed by the authors at the 13 University of Bologna premises (platforms MR4 and following). 14

15 5.1. Battery power prediction

In the present section, four different existing platforms are analyzed (respectively named *MR*1, *MR*2, *MR*3, and *MR*4), with MTOM ranging from about 1.3 to 25 kg and propeller diameter from 9 to 21 in. Battery power is
predicted according to the proposed approach and compared with the results
of flight data. Main results are then summarized in Table 3.

## 4 5.1.1. MR1: DJI Spreading Wings S1000

The DJI Spreading Wings S1000 is characterized by N = 8 rotors, each provided with a two-bladed folding CF propeller with D = 15 in and  $\Gamma = 5.2$ 6 in. Dihedral and tilt angles are, respectively,  $\psi = 8 \text{ deg and } \phi = 3 \text{ deg}$ , 7 provided the same nomenclature and definitions of [6] are adopted. Power 8 is delivered by a Li–Po battery pack with  $N_s = 6$  series–connected Li–Po 9 cells, through an integrated system made by a proprietary 40 A ESC and 10 a 4114–PRO brushless electric motor with speed constant  $k_v = 400 \text{ rpm/V}$ . 11 With a take-off mass m = 9.5 kg, the total battery power as measured by 12 the manufacturer is equal to 1500 W |53|. 13

In the given configuration, the thrust required by the single rotor is 14  $T = W/(N \cos \psi \cos \phi) = 11.78$  N, which produces an induced flow with 15 speed  $v_i = 6.49$  m/s and rotor ideal power  $P_{id} = 76.5$  W, assuming sea-16 level standard atmospheric conditions ( $\tau = 15$  °C,  $\rho = 1.225$  kg/m<sup>3</sup>, and 17  $\mu = 1.789 \cdot 10^{-5}$  Pas). Provided  $\bar{c} = 0.0175$  m, the considered propeller is 18 characterized by solidity  $\sigma = 0.0586$  while the nominal pitch angle at 75% 19 radius is  $\theta_{75} = 0.1461$  rad, according to Eq. (12). Based on BET analy-20 sis, the estimated blade tip speed in Eq. (10) is  $V_{tip}^{BET} = 135.85$  m/s, with 21  $k_{tip} = 20.92$ . Given  $\Gamma/D = 0.347$ , the corrected tip speed by Eq. (14) is 22  $\hat{V}_{tip} = 57.75$  m/s (corresponding to  $\Omega = 303.2$  rad/s). At the considered op-23 erating point it is  $V_{75} = 43.80 \text{ m/s}$  (which approximately equals the quantity 24  $0.75 \cdot \hat{V}_{tip} = 43.31 \text{ m/s}$  and the Reynolds number is Re = 56 980, provided 25

 $_{1}$   $c_{75} = 0.019$  m is the local chord length. The figure of merit is estimated from the model in Eq. (15) as f = 0.605, provided the coefficients in Eqs. (16)– 2 (18) are  $f_0 = 0.4329$ ,  $f_1 = 3.726 \cdot 10^{-6}$ , and  $f_2 = -1.241 \cdot 10^{-11}$ . The single 3 rotor shaft power is thus  $P_{sh} = P_{id}/f = 126.4$  W, the total power required 4 to hover is  $P_h = N P_{sh} = 1010.9$  W, and the torque applied to the propeller 5 by the electric motor is  $Q = P_{sh}/\Omega = 0.417$  Nm. Assuming no payload is 6 powered by the main battery pack, the only contribution to  $P_s$  is provided 7 by the avionics. Based on the statistical analysis performed in [61] on DJI 8 products, it is assumed  $P_s = 5$  W, which accounts for the current absorbed 9 by the onboard computer and the electric driving system, when no thrust is 10 generated. The electric propulsion system is characterized by DriveCalc on-11 line computation tools [48]. In particular, the system made of the considered 12 ESC and motor is outlined from the available component database and the 13 overall electric efficiency is evaluated exactly at the given operating point, 14 where  $\eta_e = 0.68$ . Taking into account Eq. (3), the total power requested from 15 the battery for the hovering flight is  $P_b = 1492.3$  W, with an estimation error 16  $\varepsilon_P = -0.51\%$  with respect to the nominal value. 17

## 18 5.1.2. MR2: DJI AGRAS MG-1P

<sup>19</sup> The procedure described above is applied to another professional platform <sup>20</sup> for which DJI provides some flight data, namely the AGRAS MG-1P, engi-<sup>21</sup> neered for agricultural spraying activities. The platform has N = 8 rotors, <sup>22</sup> each provided with a two-bladed folding CF propeller with D = 21 in,  $\Gamma = 7$ <sup>23</sup> in,  $\bar{c} = 0.029$  m, and  $c_{75} = 0.021$  m (configuration not compliant to Assump-<sup>24</sup> tion 1). The rotor configuration is planar, except for the tilt angle  $\phi = 3$ <sup>25</sup> deg, and thrust is provided by an integrated DJI system made of a 25 A ESC and a 6010 brushless electric motor. Energy is delivered by a MG-12000P Li-Po Intelligent Flight Battery with nominal voltage  $\mathcal{V}_0 = 44.4$  V ( $N_s = 6$ ) and capacity  $C_0 = 12$  Ah. The total electric power measured during a stable hovering condition is 3 250 W when the take-off mass is m = 22.5 kg [53].

In the same condition, the predicted shaft power required to hover is 5  $P_{sh} = 309.0$  W, with the figure of merit being f = 0.635, and the torque 6 is Q = 1.16 Nm. The overall electric efficiency at the considered operating 7 point is retrieved from the curves provided by the manufacturer in [62] and 8 is equal to  $\eta_e = 0.81$ . With respect to the systems power consumption, some 9 optimistic data are reported in [32], where avionics (10 W) and payload (40 10 W) are taken into account for a non-specified spraying mode of pesticides and 11 fertilizers. Taking into account the presence of the onboard high precision 12 radar module (12 W), it follows  $P_s = 62$  W and the total power requested 13 from the battery is  $P_b = 3\,114.3$  W, with a prediction error equal to -4.18%. 14

## 15 5.1.3. MR3: DJI Phantom 4 V2.0

A small rotorcraft, identified as a study case in [63], is analyzed with 16 characteristics similar to the DJI Phantom 4 V2.0 (reference drone). The 17 platform has N = 4 rotors with two-bladed  $9 \times 4.5$  E APC propellers (D = 918 in,  $\Gamma = 4.5$  in,  $\bar{c} = 0.019$  m,  $c_{75} = 0.022$  m), designed for fixed-wing electric 19 aircraft (thus partially disregarding Assumption 1). Dihedral and tilt angles, 20 not specified in [63], are assumed to be equal to the reference drone, for which 21  $\psi$  = 8 deg and  $\phi$  = 3. Power is delivered by a Li–Po battery with nominal 22 voltage  $\mathcal{V}_0 = 14.8$  V ( $N_s = 4$ ) and capacity  $C_0 = 5.9$  Ah. Propulsion is 23 obtained by a set of 12 A ESCs and Flyduino X2208 brushless motors. With 24 a take-off mass m = 1.375 kg, each ESC requires 39 W of electrical power 25

at hover, the torque delivered by the electric motor to its propeller is 0.05 1 Nm at 5 600 rpm, and the shaft power is equal to 31 W. Assuming  $P_s = 5$  W 2 [61], the total battery power is thus  $(39 \cdot 4) + 5 = 161$  W, according to [63]. 3 Given  $\Gamma/D = 0.5$  and  $\sigma = 0.106$ , the estimated rotor angular rate is 4 = 554.8 rad/s (5298 rpm), with an error equal to -5.39% with respect Ω 5 to the indicated value. A figure of merit f = 0.644 is determined, and the 6 predicted shaft power is  $P_{sh} = 30.8$  W (estimation error: -0.65%). The 7 torque results to be Q = 0.056 Nm (estimation error: +11.2%) and, based 8 on the efficiency curves provided by the authors in [63], the propulsion system 9 is characterized by  $\eta_e = 0.79$ . The required electrical power for each ESC is 10 38.9 W (estimation error: -0.26%) and the total power requested from the 11 battery for the hovering flight is  $P_b = 160.5$  W (estimation error: -0.31%). 12

## 13 5.1.4. MR4: DJI Spreading Wings S800 EVO

The proposed method is also validated by means of flight tests performed 14 by the authors at the University of Bologna premises. A DJI Spreading 15 Wings S800 EVO is considered, characterized by N = 6 rotors and the same 16 propulsion system analyzed for the DJI S1000 in Section 5.1.1. Dihedral 17 and tilt angles are, respectively,  $\psi = 8 \deg$  and  $\phi = 3 \deg$  and power is 18 delivered by a Tattu 25C battery made of  $N_s = 6$  series–connected Li–Po 19 cells with nominal voltage  $\mathcal{V}_0 = 22.2$  V and capacity  $C_0 = 22$  Ah. The empty 20 operative mass is 4 kg and the considered battery weighs 2.509 kg, such that 21 the take off mass is m = 6.509 kg and the thrust required from the single 22 rotor is T = 10.76 N. A hovering flight test was performed at the ambient 23 temperature  $\tau = 15$  °C and pressure p = 98460 Pa, with estimated air 24 density  $\rho = 1.1904 \text{ kg/m}^3$  and dynamic viscosity  $\mu = 1.789 \cdot 10^{-5} \text{ Pa s.}$  Taking 25

Table 3: Analyzed multirotor platforms and battery power prediction errors.

| Multirotor | Mass [kg] | N | D [in] | $\Gamma$ [in] | f     | $\eta_e$ | $P_b$ est. [W] | $P_b$ meas. [W] | $\varepsilon_P$ [%] |
|------------|-----------|---|--------|---------------|-------|----------|----------------|-----------------|---------------------|
| MR1        | 9.5       | 8 | 15     | 5.2           | 0.605 | 0.68     | 1492.3         | 1500            | -0.51               |
| MR2        | 22.5      | 8 | 21     | 7             | 0.635 | 0.81     | 3114.3.3       | 3250            | -4.18               |
| MR3        | 1.375     | 4 | 9      | 4.5           | 0.644 | 0.79     | 160.5          | 161             | -0.31               |
| MR4        | 6.509     | 6 | 15     | 5.2           | 0.597 | 0.85     | 833.4          | 828.2           | 0.63                |

into account the information obtained in flight by averaging the readings of
a wattmeter sensor, the measured power resulted to be 828.2 W.

According to the proposed prediction method, the shaft power required to hover is  $P_{sh} = 113.4$  W and the torque is Q = 0.39 Nm, with the figure 4 of merit being f = 0.597. The electric propulsion system is characterized by 5 DriveCalc online computation tool [48], according to which  $\eta_e = 0.85$ . The 6 only contribution to  $P_s$  is provided by the avionics, made of the onboard 7 computer and telemetry system. Based on the statistical analysis performed 8 in [61], it is assumed  $P_s = 5$  W and the estimated total power delivered by 9 the battery pack is  $P_b = 833.4$  W. In this case, the error of the proposed tech-10 nique for predicting battery power is only +0.63% with respect to obtained 11 measurement. 12

## <sup>13</sup> 5.2. Flight endurance and sizing procedure validation

In what follows, two test cases are analyzed. While addressing the validity
of the battery power estimation method, endurance tests allow to address the
flight time prediction problem presented in Section 4.

## 17 5.2.1. MR5: UNIBO MDV-X4 Multirotor

The first case is represented by the analysis of a rotorcraft with N = 4planar rotors, developed at the University of Bologna (platform MR5, see



Figure 8: The quadcopter MDV-X4 developed at the University of Bologna (MR5).

Figure 8). Power is delivered by the parallel connection of 2 Tattu 25C Li– 1 Po batteries with the same specifications reported in Section 5.1.4, such that 2  $\mathcal{V}_0 = 22.2$  V, and the nominal capacity is  $C_0 = 22 \cdot 2 = 44$  Ah. Propulsion is 3 obtained by a set of T–Motor U8 motors with  $k_v = 135 \text{ rpm/V}$  [64], driven 4 by T60A electronic controllers, and CF propellers by T–Motor with D = 295 in,  $\Gamma = 9.5$  in,  $\bar{c} = 0.057$  m, and  $c_{75} = 0.055$  m (configuration not compliant 6 to Assumption 1). The empty operative mass is 4.245 kg and the considered 7 battery pack weighs  $2.509 \cdot 2 = 5.018$  kg, with the result that the take off mass 8 is m = 9.263 kg and the thrust required from the single rotor is T = 22.719 N. Three hovering flight tests were performed at the ambient temperature 10  $\tau=22~^\circ\mathrm{C}$  and pressure  $p=98\,650$  Pa, with estimated air density  $\rho=1.1644$ 11 kg/m<sup>3</sup> and dynamic viscosity  $\mu = 1.822 \cdot 10^{-5}$  Pa.s. During each flight, the 12 battery pack was discharged to the 80% of nominal capacity, that is to say 13  $C_f = K C_0 = 0.8 \cdot 44 = 35.2$  Ah, starting from an initial fully-charged 14

<sup>1</sup> condition. The average values of the measured battery power  $P_b$  and flight <sup>2</sup> time  $t_f$  resulted to be 703.7 W and 60.4 min, respectively.

Based on the available data, the predicted rotor angular rate is  $\Omega = 171.4$ 3 rad/s. The shaft power required to hover is  $P_{sh} = 154.4$  W, with the figure of 4 merit being f = 0.7 at Re = 154853. The efficiency of the electric propulsion 5 system is retrieved from [47], where  $\eta_e = 0.88$ . No power–consuming payload 6 is carried on board and the avionics is represented by a DJI Wookong–M 7 system, for which  $P_s = 5$  W. The predicted power required from the battery 8 pack is  $P_b = 707.1$  W (estimation error: +0.48%). Hovering endurance is 9 estimated by Eq. (20), where  $\delta = 25.07$ ,  $\epsilon = -1.011$ , and  $\beta = 0.9675$  are the 10 temperature-compensated battery coefficients, obtained from Eqs. (21)-(25). 11 Predicted flight time is 61.3 min, with an estimation error of +1.49%. 12

# 13 5.2.2. MR6/7/8/9: DJI F550 Flame Wheel

The battery-sizing procedure described in Section 4.2 is experimentally 14 investigated for a DJI F550 Flame Wheel planar hexarotor (N = 6), where 15 propulsion is provided by a set of DJI Opto 30A ESCs and DJI 2212 brushless 16 motors. The nominal empty operative mass is 1.35 kg, which includes the 17 contribution of computer and telemetry system, based on a Pixhawk PX4 18 board with power absorption  $P_s = 5$  W. In order to calculate the battery 19 weight/energy ratio to be used during the design process, a reference 25C 20 Li–Po battery by Tattu is considered with nominal voltage  $\mathcal{V}_0 = 14.8$  V 21  $(N_s = 4)$ , capacity  $C_0 = 9$  Ah, and mass 0.810 kg  $(W_b = 7.94 \text{ N})$ , with the 22 result that  $\chi = W_b / (\mathcal{V}_0 C_0) = 0.0596 \text{ N/(Wh)}.$ 23

The propulsion system made of ESC and motor was previously characterized over an adequate range of angular rate and torque by the RCbenchmark thrust stand at room temperature τ = 24 °C, with voltage stabilized at 14.8
V. Adopting the same procedure described in Section 3, static thrust tests
were thus performed on three sample propellers (the same marked as 1, 2,
and 4 in Table 1) and the data relative to the measured torque, angular
rate, and electrical power were collected. Provided that the electrical efficiency is calculated as the ratio between the available shaft power and the absorbed electrical power, obtained results are reported in Figure 9. Data

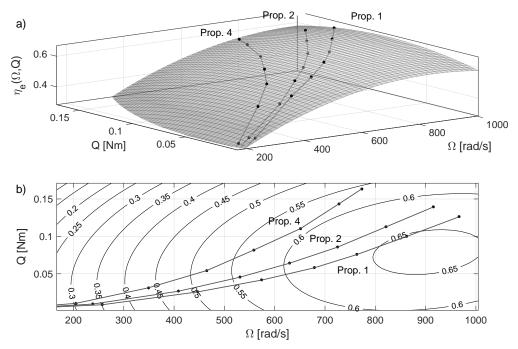


Figure 9: Electrical efficiency of a DJI 2212 brushless motor with DJI Opto 30A ESC: a) measured data points and fitting surface; b) contour plot with corresponding iso–response lines.

<sup>8</sup> points in Figure 9.a are fitted by a second-order polynomial surface, such <sup>9</sup> that  $\eta_e(\Omega, Q) = p_{00} + p_{10} \Omega + p_{01} Q + p_{20} \Omega^2 + p_{11} \Omega Q + p_{02} Q^2$ , with coeffi-<sup>10</sup> cients  $p_{00} = 7.145 \cdot 10^{-2}$ ,  $p_{10} = 1.259 \cdot 10^{-3}$ ,  $p_{01} = 0.4377$ ,  $p_{20} = -7.513 \cdot 10^{-7}$ , <sup>11</sup>  $p_{11} = 1.284 \cdot 10^{-3}$ ,  $p_{02} = -10.13$ , and root mean square residual equal to

Table 4: Predicted and measured performance data for different DJI F550 configurations equipped with the same battery pack (Li–Po,  $N_s = 4$ ,  $C_0 = 9$  Ah, K = 0.6).

| Configurat | tion $W_0$ [N] | Propeller | f     | $\eta_e$ | $P_b$ est. [W] | $P_b$ meas. [W] | $\varepsilon_P$ [%] | $t_f$ est. [min] | $t_f$ meas. [min] | $\varepsilon_t$ [%] |
|------------|----------------|-----------|-------|----------|----------------|-----------------|---------------------|------------------|-------------------|---------------------|
| MR6-9      | 18.51          | 1         | 0.683 | 0.646    | 468.2          | 459.3           | 1.94                | 10.03            | 9.83              | 2.03                |
| MR7-9      | 13.24          | 1         | 0.676 | 0.625    | 351.4          | 352.3           | -0.26               | 13.45            | 13.05             | 3.07                |
| MR8-9      | 18.86          | 4         | 0.668 | 0.584    | 432.2          | 426.0           | 1.46                | 10.88            | 10.77             | 1.02                |
| MR9-9      | 13.59          | 4         | 0.654 | 0.557    | 334.5          | 342.2           | -2.26               | 14.15            | 14.13             | 0.14                |

1 0.015.

Starting from the reference platform described above, 4 different multirotor configurations are defined, which differ by the selection of propellers 3 (the ones marked as 1 and 4 in Table 1) and the particular empty-operative 4 weight  $W_0$  (varied by the quantity  $\Delta W_0|_{pl} = 5.27$  N through the equipment 5 of an additional 0.537 kg payload system). For each configuration, a flight 6 test was performed at temperature  $\tau = 26$  °C and pressure  $p = 97\,903$  Pa (es-7 timated air density  $\rho = 1.1401~{\rm kg/m^3}$  and dynamic viscosity  $\mu = 1.841\cdot 10^{-5}$ 8 Pas) while discharging the battery to the 60% of nominal capacity ( $C_f$  = 9  $KC_0 = 0.6 \cdot 9 = 5.4$  Ah). Main results are reported in Table 4 in terms of 10 model-predicted figure of merit, electrical efficiency, battery power, and flight 11 endurance. To this end, battery coefficients, evaluated from Eqs. (21)-(25), 12 are  $\delta = 17.93$ ,  $\epsilon = -1.025$ , and  $\beta = 0.9632$ . Data are compared to measured 13 values and estimation errors are calculated. Note that, in the same loading 14 condition, the adoption of Propellers '4' determines a total increase of empty 15 weight by about  $\Delta W_0|_{prop} = 0.35$  N with respect to the case in which pro-16 pellers '1' are adopted. It is evident from Table 4 that, for all the analyzed 17 configurations, the estimation errors of both battery power ( $\varepsilon_P$ ) and flight 18 time  $(\varepsilon_t)$  are lower than 5%, which vindicates the validity of the proposed 19 approach. 20

In Figure 10 the discussion of the sizing procedure illustrated in Section 4.2 is applied to the present case, while comprising the data points already reported in Table 4 (round markers). In particular, the curves representing predicted endurance are plotted as a function of nominal capacity for all the considered configurations. The presence of a maximum in all the

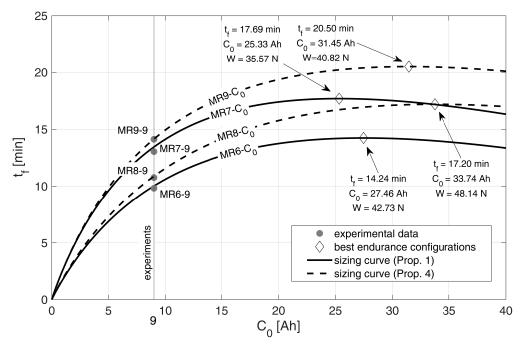


Figure 10: Predicted and measured performance data for different DJI F550 configurations (the symbol 'MRX-Y' refers to multirotor configuration 'X' with battery nominal capacity 'Y' Ah).

5

<sup>6</sup> curves clearly points out that, if endurance is pursued as the most relevant
<sup>7</sup> goal in the design process, it is useless to increase the size of the battery pack
<sup>8</sup> beyond a certain limit, provided that the corresponding growth in rotorcraft
<sup>9</sup> weight affects required power. Best endurance configurations are indicated
<sup>10</sup> in Fig. 10 by diamond markers. Note that, for all the considered configura<sup>11</sup> tions, the maximum is 'flat', meaning that very large variations of battery

weight are necessary for marginal gains in terms of expected flight time.
From the practical standpoint, this growth in battery capacity is clearly not
justified, when one considers that a bigger battery is more expensive and the
corresponding additional weight typically requires more powerful motors and
robust structures.

As an example, consider configuration MR6 - 9 in Fig. 10, for which 6 the predicted hover endurance is 10.03 min when K = 0.6. Assume that, 7 in order to comply with more stringent requirements, the endurance must 8 be extended by 2 minutes with the same discharge percentage. Taking into 9 account Figure 10, the target flight time of 12.03 min can be obtained in 10 2 ways. In the first case, the same set of propellers is used (Propellers 1) 11 but a bigger battery with nominal capacity equal to at least 13.09 Ah is 12 required (corresponding take-off weight: W = 30.75 N). In the second case, 13 the multirotor is equipped with Propellers 4 and a bigger battery with at 14 least 10.72 Ah (take-off weight: W = 28.32 N). At the time of writing the 15 present paper, the considered battery type by Tattu is characterized by a 16 cost of about 15.60 US dollars per Ah [65]. The complete sets of Propellers 1 17 and 4, equivalent to the DJI product, respectively cost 4.50 and 7.50 dollars, 18 according to [56]. With this in mind, the first upgrade solution would de-19 termine an additional cost of  $4.09 \cdot 15.60 = 63.80$  dollars (battery upgrade). 20 The second solution would require 29.83 dollars, of which  $1.72 \cdot 15.60 = 26.83$ 21 dollars for the battery upgrade and only 3 dollars for the replacement of the 22 full propellers set. 23

The model derived in Eqs. (34)–(38), which analytically provides an approximate value to the best endurance capacity, is finally validated. The exact best endurance configurations are detailed in Figure 10. The minimum estimation error is obtained for platform  $MR9 - C_0$ , where  $W_{be} = 40.82$  N and  $W_{be}^{\star} = 41.96$  N, and is equal to +2.79%. The maximum error is obtained for platform  $MR8 - C_0$ , where  $W_{be} = 48.14$  N and  $W_{be}^{\star} = 54.36$  N, and is equal to +12.92%.

## 6 6. Conclusions

Performance of an electrically-powered multirotor is discussed by means 7 of a novel integral formulation for constant-power battery-discharge process. 8 The analysis is based on the estimation of power required from the battery 9 pack during a hovering condition. Starting from the results available from 10 blade element theory, an analytical expression is derived, on an experimental 11 basis, for the figure of merit of a class of commercial-off-the-shelf propellers. 12 The main outcome from these propeller tests is discussed, provided that the 13 blade Reynolds number plays a significant part in determining its perfor-14 mance. As a by-product, the trim angular rate of the rotors and the torque 15 applied by the electric motors to the propellers are derived. 16

Numerical simulations and an experimental campaign validate the capa-17 bility of the proposed approach to accurately predict the hover endurance of 18 existing platforms. At the same time, a very simple procedure is outlined 19 to design novel configurations or upgrade a selected propulsion system, in 20 order to satisfy given requirements in terms of flight time, take-off weight, 21 and prototyping costs. In this respect, a closed-form solution to the best 22 endurance battery capacity is also derived. The effectiveness of the proposed 23 approach and the simplicity of the analytical formulation are shown to be of 24

general validity and prove to be encouraging in the framework of rotorcraft
preliminary sizing.

Future developments, allowing for improved performance prediction and 3 optimal sizing procedures include: 1) detailed characterization of the induced 4 flow by the propeller in order to further investigate the contribution of both 5 induced and profile power; 2) the extension of the applicability field of the 6 proposed method to a wider family of commercial-of-the-shelf propellers, 7 including counter-rotating configurations, thus relaxing the requirements of 8 Assumption 1; 3) the derivation of estimation algorithms to perform battery 9 parameter identification in-flight; 4) the adaptation of the proposed method 10 to the analysis of different flight conditions, such as cruise, climb, or descent, 11 with the aim to accurately estimate the required power, endurance, and range 12 performance, and to provide sizing guidelines for complex mission scenarios. 13

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