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Snow avalanche speed determination using seismic methods

I. Vilajosana^{a,*}, G. Khazaradze^a, E. Suriñach^a, E. Lied^b, K. Kristensen^b

^a Grup d'Allaus (RISKNAT); Dept. de Geodinàmica i Geofísica, Universitat de Barcelona, Martí i Franquès s/n, 08028, Barcelona, Spain ^b Norwegian Geotechnical Institute, Postbox 3930 Ullevaal Stadion, N-0806, Oslo, Norway

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$\overline{7}$ Abstract

8 We present a new method to determine the average propagation speed of avalanches using seismic techniques. Avalanche 9 propagation speeds can reach 70 m/s and more, depending on a wide range of factors, such as the characteristics of the avalanche 10 track (e.g. topography) and the snowpack properties (e.g. density). Since the damage produced by the avalanche depends primarily 11 on the size and on the speed of the avalanche, the knowledge of the latter is therefore crucial for estimating avalanche induced hazard in inhabited mountain areas. However, our knowledge of this basic physical parameter is limited by the difficulty of 12conducting various measurements in the harsh winter weather conditions that often accompany this natural phenomenon. 13

14The method of avalanche speed determination presented in this paper is based on cross-correlation and time-frequency analysis techniques. The data used in this study come from the Ryggfonn (Norway) avalanche experimental site operated by the Norwegian 1516 Geotechnical Institute (NGI), and recorded by an array of 6 geophones buried along the main avalanche path during the 2003-2004 17and 2004-2005 winter seasons. Specifically, we examine the speeds of 11 different events, characterized by size and snow type. The results obtained are compared with independent speed estimates from CW-radar and pressure plate measurements. As a result 18of these comparisons our method was validated and has proved to be successful and robust in all cases. We detected a systematic 1920behaviour in the speed evolution among different types of avalanches. Specifically, we found that whereas dry/mixed type flow 21events display a complex type of speed evolution in the study area with a gradual acceleration and an abrupt deceleration, the speed 22 of the wet snow avalanches decreases with distance in an approximately linear fashion. This generalization holds for different size 23events.

24 In terms of time duration and maximum speed of the studied events, dry/mixed type avalanches lasted between 8 to 18 s and 25reached speeds up to 50 m/s, whereas the duration of wet avalanches ranged between 50 and 80 s and their maximum speeds were 2610 m/s.

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- 29Keywords: Seismic record; Snow avalanche; Time-frequency analysis; Speed
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1. Introduction 31

32 Land use planning based on hazard mapping is the 33 most cost-effective way to mitigate avalanche risk in

> * Corresponding author. Fax: +34 93 402 13 40. E-mail address: vilajosana@ub.edu (I. Vilajosana).

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inhabited areas. This procedure usually involves 34estimating the run-out distance of hypothetical ava-35lanches with long return periods and is usually achieved 36 with numerical models based on fluid dynamics 37 equations (Harbitz et al., 1998). One of the main output 38 parameters of these models is the avalanche speed. The 39speeds obtained from the data analysis of large scale 40

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41 experiments are compared with those obtained by the42 models in order to calibrate them.

43Avalanche speeds depend on a wide range of factors, including the characteristics of the track (e.g. topogra-44 phy) and of snowpack properties (e.g. grain/clod size 45and density). Avalanches can reach speeds up to 70 m/s 46and more. Since the damage produced by the avalanche 47 depends on its propagation speed, the knowledge of this 48 49parameter is crucial for estimating avalanche induced hazards in inhabited mountain areas. However, our 5051knowledge of this basic physical parameter is limited by the difficulty of conducting measurements, which is 52compounded by the harsh weather conditions that often 5354accompany snow avalanches and by the complexity of the physical phenomenon itself. 55

Earlier studies of speed determination of snow 56avalanches have been based on the processing of 57video images (Granada et al., 1995; McElwaine, 58592004), the determination of internal clod speeds using 60 LED-photocells (Dent et al., 1998), on the interpretation of data from pressure load cells (Norem et al., 1985), 61 62 and Doppler-radar (Gubler, 1987) techniques among others. The few studies of avalanche speed determina-63 64 tion based on seismic methods include works by Schaerer and Salway (1980), Nishimura et al. (1993), 65 66 and Nishimura and Izumi (1997), who used basic picking techniques to obtain the arrival time of the 67 avalanche body over geophones installed along the 68

avalanche path. However, none of these studies describe69in detail the criteria of the selection techniques used.70

In this paper we present a new method for determining 71the average propagation speed of snow avalanches from 72seismic time series. Specifically, we present the averaged 73speed values of the avalanche front obtained for different 74avalanches, and their evolution with distance along the 75main propagation path. The data are from the Ryggfonn 76 avalanche experimental site in Norway operated by the 77 Norwegian Geotechnical Institute (NGI) (Lied et al., 78 2002). They were obtained from a set of 6 geophones and 79from independent sources such as continuous wave 80 Doppler-radar (CW-Doppler radar) and pressure Load 81 Plates (LP) measurements (Gauer et al., 2004). 82

The methods for determining the avalanche speed 83 presented in this paper are based on cross-correlation 84 and time-frequency analyses of the data recorded by 85 seismic sensors. 86

For the last decade our group at the Universitat de 87 Barcelona (UB) has been studying the seismic signals 88 generated by avalanches at different sites in Europe. The 89 most important results obtained in these studies are 90 related to reproducibility, time evolution of the seismic 91 signal spectra, and identification of various sources of 92seismic energy (e.g. Biescas et al., 2003; Suriñach et al., 93 2000). The method of speed determination of ava-94 lanches presented in this paper is a continuation of these 95 previous studies. 96



Fig. 1. Detailed profile of the lowest part of the avalanche track in Ryggfonn including the installed instrumentation. The inset in the upper right corner shows the complete Ryggfonn avalanche path profile.

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97 2. Experimental site and data

98 The Ryggfonn full-scale avalanche site, situated 99 500 km north-west of Oslo, Norway, was set up to study snow avalanches by the NGI in 1980 (Lied et al., 100 2002). Since then, approx. 2-3 avalanches per year have 101 been released at the site. The avalanche path at Ryggfonn 102103has a drop of 900 m and a horizontal length of 2100 m 104 (Fig. 1). The avalanches released at the site range in volume between 10,000 m³ and 500,000 m³, reaching 105maximum velocities of 60 m/s. In the lower part of the 106 107 avalanche path there is a retaining dam of unconsolidated 108material, 16 m in height and 75 m in crown length. This 109 dam is equipped with different instruments (Fig. 1). Two 3D-load plates (LP1, LP2) are placed at the front. Three 110 111 1D-4.5 Hz vertical component geophones (GF4, GF5, and GF6) are embedded in the dam. Two of these (GF4 112 113and GF5) are placed beside each load plate. A 6.5 m steel 114mast with a horizontal uni-axial geophone (HG1) located on top of the dam completes the installation. In the 115avalanche path, two more geophones, spaced 47.4 m 116117 apart, are buried in the ground (GF2, GF3) (Fig. 1). A 4.5 m high concrete structure containing three load cells 118 119(LC1, LC2, and LC3) is placed approx. 230 m up-slope from the dam in the main avalanche path. A 5.5 m high 120cylindrical steel tower equipped with two more load cells 121122(LC4, LC5) and one geophone (GF1) with the same characteristics as the others is placed 90 m above this 123124structure.

125A shelter containing the control and recording instruments is located in the valley 500 m east of the 126dam, and is provided with power, telephone line and 127ISDN connection. The recording system is triggered by 128geophone GF1 when the avalanche front hits the steel 129tower. All the measurements from the different instru-130ments are recorded at a sampling rate of 150 sps with a 131local common base of time. The total length of the 132records is 150 s including 25 s of pre-triggered data. 133

During the 2003-2004 winter season a frequency 134 135modulated continuous wave Doppler radar (CW-Dopp-136ler radar) was also operational (Sigurðsson et al., 2004). In this study we analysed the data from 11 avalanches 137that occurred during the winter seasons 2003-2004 and 1382004-2005 and one from 2000 (Table 1). The ava-139140 lanches differed in size and type of snow. All the avalanches with the exception of events 6 and 7 were 141triggered naturally. Unfortunately, the availability of 142complementary information including field observa-143144tions and video images is limited. Seismic and load plate data analyses indicated that in avalanche 2 the dense 145body did not reach the dam although the aerosol passed 146 147 over the dam. Avalanche 4 did not reach the dam (field

List of studied events					
No. event	Date	hh:mm (local time)	Release	Type ^a	Size ^b
1	2003/12/15	16:35	Natural	Dry/mixed	Medium (3)
2	2003/12/17	03:14	Natural	Dry/mixed	Medium (3)
3a	2004/02/04	06:10	Natural	Wet	Medium (3.5)
3b	2004/02/04	06:12	Natural	Wet	Medium (3.5)
4	2004/02/24	08:50	Natural	Dry/mixed	Small (2)
5a	2004/02/24	22:30	Natural	Dry/mixed	Medium (3)
5b	2004/02/24	22:31	Natural	Dry/mixed	Medium (3)
6	2004/02/28	15:22	Artificial	Dry/mixed	Medium (3.5)
7	2000/02/17	13:55	Artificial	Dry/mixed	Large (4)
8a	2005/01/07	04:17	Natural	Dry/mixed	Medium (3.5)
8b	2005/01/07	04:18	Natural	Wet	Medium (3.5)

^a Dry/mixed: formed by aerosol and dense parts.

^b According to the Canadian avalanche size classification (McClung and Schaerer, 1993).

observation). The two natural events at 02/04/2004 148 triggered the data acquisition system at an interval of 149160 s. Given that the generated seismic signal of these 150events is continuous without interruption for 230 s, it is 151difficult to ascertain whether these correspond to two 152independent avalanches or to one avalanche with two 153parts. In our study we regard them as independent wet 154flow avalanches, denoted as events 3a and 3b to ease the 155subsequent processing. During the night of the 02/24/1562004 two triggers (5a and 5b) occurred within an 157interval of 40 s. We treated them as independent ava-158lanches because the events were clearly separated by a 159period of very low signals in the time series. In the 160afternoon of 01/07/2005 two consecutive triggers re-161corded a naturally released avalanche. After studying 162the signals it is reasonable to assume that the avalanche 163consists of two different parts (dry/mixed part and wet/ 164dense flow). 165

3. Data analysis

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The main principle of the presented method of 167avalanche speed determination is based on the differ-168ence in the arrival times of the avalanche over two 169separate seismic sensors. To this end, we applied the 170procedure described below based on the characteristics 171of the seismic wave propagation. In our approach, it is 172assumed that at least the front of the avalanche reaches 173the geophone. 174

The running spectrum (RS) of the signal is studied 175 prior to determining the avalanche arrival time over a 176 sensor in the time series. In the RS, a selection of the 177 time interval corresponding to the first window showing 178 the highest amplitudes in the high frequency content of 179

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the spectra is performed as presented in Fig. 2b. We 180attribute this time interval to the arrival of the avalanche 181 182front over the sensor. The increase in the amplitude in the RS with time is produced by the reduction of the 183distance source-receiver as the avalanche front 184approaches the sensor (Suriñach et al., 2005). This is 185physically supported by the anelastic attenuation of 186 187 seismic waves with distance (Aki and Richards, 1980), and is corroborated by the results of earlier studies. In 188 these studies we demonstrated that the peaks of 189190maximum seismic energy in the high frequency content of the time series are related to snow erosion over the 191

geophone. These results were obtained from the192correlation of data from FMCW radar and from seismic193sensors placed together in the avalanche path at the194Vallée de la Sionne experimental site in Switzerland195(Biescas, 2003; Biescas et al., 2002).196

The selection of the window is performed by means 197 of 1) computation of the running spectrum (RS) of the 198 seismic time series based on short time Fast Fourier 199 Transform (FFT) (Brigham, 1974). We used a Hanning 200 window and an FFT length of 128 samples (0.85 s) with 201 a 50% overlapping window taking into account the data 202 sampling rate (150 sps) and the trade-off between time 203



Fig. 2. a) GF2 time series of the avalanche released on 2004/02/28. b) Running spectra, the arrow indicates the selected time window corresponding to the arrival of the avalanche front over GF2. c) Detail of the time series window pre-selected in the RS, the arrow indicates the time of the avalanche arrival over GF2.

and frequency resolutions (Flandrin, 2002); and 2)
selection of the first time window showing maximum
amplitudes at the highest frequencies in the RS (Fig. 2b).
The arrival time in the seismic time series is
performed by picking a discontinuity in the amplitude
or/and frequency of the time series in the selected

210 window using the standard seismological technique 211 (PK) (Fig. 2c). However, there are no characteristic 212 features to identify the arrival of the front.

As a result of this procedure the arrival time of the 213214 avalanche front at each geophone is obtained. Subsequently, using the distance between the geophones the 215216average propagation speed of the avalanche between the 217pairs of geophones is obtained. When the PK procedure is not easy due to the lack of clarity of the wave arrival 218219 as in the case of small avalanches which generate weak vibrations or in the case of signals produced by slow 220dense avalanches recorded in the sensors located in the 221222dam (GF4 and GF5) (further discussion is presented 223below) an alternative, cross-correlation procedure (XC) 224is applied.

The XC procedure consists of determining the lag time between the previously selected seismic time series windows corresponding to two separate geophones. The lag time, which indicates the time shift between the two time series, yields the difference in arrival time of the avalanche front needed to obtain the average propagation 230speed of the avalanche between the two points (Fig. 3). 231The XC method assumes that signals generated by the 232same source must be comparable. Earlier studies 233demonstrate that the main sources of the seismic signals 234are snow erosion, changes in the slope and impacts with 235obstacles (Suriñach et al., 2001). In our case, the signals 236to be identified are mostly produced by snow erosion, 237which is assumed to occur mainly near the front of the 238 avalanche (Gauer and Issler, 2004). 239

The cross-correlation was performed on a windowed 240subset of the seismic time series. The time windows to be 241 correlated are selected considering 5-10 s prior to the 242selected time in the RS. This window includes the length 243of the total time scale of the vortex inside the avalanche 244front (McElwaine, in press) and the signal before the 245arrival of the avalanche front over the sensor. Correlation 246of a longer time series provides no information on the 247propagation of the avalanche front. Rather, it reflects the 248specifics of the propagation path and the whole event. The 249selection of the window demands a prior detailed analysis 250of the signal, taking into account the shape of each time 251series to identify the part of the signal produced by the 252approaching avalanche and not by distant impacts, which 253are easily identifiable because they are observed almost 254simultaneously in all the time series. Correlations with 255



Fig. 3. a) and b) Time series windows of the avalanche released on 2004/02/28 for cross-correlation. c) Cross-correlation of the time series. The arrow indicates the selected lag time.

positive lag times are excluded since these would imply 256an upward propagation of the avalanche. Also excluded 257258

are the lag times that give unrealistic speeds (<1 and 259>70 m/s, for the Ryggfonn path), which can be attributed to the propagation of sound and/or ground vibrations 260 rather than the snow avalanche.

The XC method involves pairs of seismic time series. 262As a consequence, we were able to obtain the differences 263



Fig. 4. Comparison of the speeds of 11 avalanches released at Ryggfonn obtained from the data of various instruments (CW-radar, geophones, load plates). Continuous lines shows the path profile and dots indicate the position of the measuring instruments. The speeds are presented at the midpoint between adjacent instrument locations.

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264 between the arrival times for four pairs of sensors (GF1-265GF2, GF2-GF3, GF3-GF4 and GF4-GF5). This is not the 266 case with the PK method with which we obtain an 267estimate of the avalanche arrival time at each geophone. Avalanche average speed estimates are obtained using the 268 269distances involved. Data from GF-6, located on top of the dam (Fig. 1) were of no use because of the spatial 270271distribution of the geophones and the ground character-272istics of the dam (formed by loose gravel with poor vibration transmission). 273

274 4. Results and discussion

275Using the methods described in the previous section 276(PK and XC) we estimated the speeds for the 11 ava-277 lanches at Ryggfonn listed in Table 1. The estimates of the average avalanche propagation speeds using both methods 278279are shown in Fig. 4. To assess the reliability of our me-280thods, we compared our results with the speed measurements from a CW-Doppler radar (Sigurðsson et al., 2004) 281282and with estimates from the arrival time at the load plates 283 (Gauer et al., 2004). In Fig. 4 the average avalanche propagation speeds are represented as a function of the 284285horizontal distance, the steel tower being the origin of the distances. The average avalanche propagation speed 286287between two adjacent geophones is depicted midway 288between the two sensors to show the evolution of the avalanche along the path. The positions of the sensors are 289290indicated by dots on the path profile in Fig. 4. Averaged 291speeds obtained from the load plates (steel tower, concrete 292structure and dam) are plotted midway between the load plates, and speeds from the radar (obtained by averaging 293the corresponding values from Sigurðsson et al. (2004)) 294295are also indicated in Fig. 4.

In general, there is a reasonable agreement between 296297the different speed estimates. However, the different sensitivity of the different types of equipments used to 298299detect the avalanche, which is reflected in the results, should be pointed out. As regards the LP sensors, the 300 301 values are obtained from the arrival time of the avalanche at the load cells. This determination is usually 302303 easy and unambiguous because of a sudden increase in pressure observed in the record of the LP. Nevertheless, 304although the strong peaks which are probably produced 305 306 by the saltation layer or by the dense part of the avalanche are easy to detect, it is much harder to detect 307 308 the signals generated by the small powder part, which in some cases precedes the dense core. The impacts 309 310 produced by the saltation layer on the LP are of slightly 311lower amplitude and higher frequency than that produced by the dense part. The impacts of the powder 312part are only detected when the LP is not covered by 313

snow. As for the radar, it is also difficult to detect the 314powder part of small avalanches because of the poor 315reflectivity of the powder cloud of a low density. 316 Moreover, the estimated speeds obtained by radar are 317not directly comparable to the front speeds determined 318by the other methods given that the radar signal is 319composed of the reflections from many parts of the 320 avalanche body. This is a consequence of the wide angle 321range from which the radar data are obtained (Gubler, 322 1987). 323

As regards the seismic method, previous studies 324 allow us to determine the origin (source) of the seismic 325signals associated with snow avalanches. It has been 326 confirmed that the powder part is detected despite the 327 low signal amplitude (Suriñach et al., 2001). One of the 328 problems of using seismic sensors to study avalanches is 329 that the origin of the signal, unlike earthquakes is not 330 punctual, but rather it is produced by unlocalized 331 multiple moving sources. As a result the recorded signal 332 from the moving front is contaminated by signals from 333 other parts of the avalanche. These parts also act as 334sources generating signals that hinder the selection of 335 the arrival times; in our case, the contaminant signals are 336 associated with impacts with the dam and changes in the 337 slope of the path (Suriñach et al., 2001). The application 338 of the RS and an analysis of the seismic time series help 339 us to select (discriminate) the signals associated with the 340erosion produced by the avalanche front. 341

When comparing the results obtained by the different 342 methods in Fig. 4 it should be borne in mind that the 343 average speeds are plotted midway between the pair of 344considered sensors. Overall, the agreement between the 345results is satisfactory. The speeds estimated using the 346 two seismic approaches (PK and XC) in most of the 347 cases are compatible within the error in the determina-348 tion of the arrival time over the sensor (0.4 s which 349corresponds to the time resolution of the RS) (Fig. 4). In 350general, when the wave arrival is clear the PK method is 351more precise than the XC method. However, for small 352avalanches and slow wet/dense flows near the dam it 353 was not possible to apply the PK method because of the 354difficulty of selecting the correct wave arrival by 355picking. We attribute this difficulty to 1) the presence 356of the dam, which generates noise in the signal; 2) the 357 low amplitude of the seismic signal detected in the 358 geophones in the dam, probably caused by the large 359 amount of snow covering the geophones which 360 attenuates the signal, and 3) to the low speed or small 361size of the avalanche, generating little seismic energy. In 362 this case the XC method is more appropriate. Never-363 theless, this method may also be unreliable in the 364 presence of very noisy signals. 365

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366 As regards the load plates, the speed values are in general consistent with those obtained from the seismic 367 368 data. The original measurements obtained by radar yield 369 the avalanche speed as a function of time in intervals ranging from 1.5 to 4.5 s. In order to assign a horizontal 370 distance to the radar speed values between two given 371sensors, these speeds were averaged between the arrival 372 373 times of the avalanche front over the sensors. These 374 arrival times were extracted from the RS calculations and LP data analysis. The speed values from the radar 375 376 show differences in relation to the LP and geophones 377 measurements. This was expected given that the 378 geophones and the load plates measure the front 379 speed, whereas the radar records a composite signal proceeding from all the moving parts of the avalanche 380 within the range of the radar. We believed that the 381averaged speeds correspond to two different parts of the 382 383 avalanche. Whereas the high speed values from the 384radar at approx. 100 m in event 1 (Fig. 4) correspond to the aerosol front of the avalanche (simultaneous 385pressure measurements show low values (Sigurðsson 386 387 et al., 2004)), the lower values of the speed obtained from the load plates and seismic sensors correspond to 388 389the dense body. In cases where the dense and aerosol parts coexist, geophones detect the former preferentially 390because of the higher vibrations produced; the same 391behaviour is observed for the load cells. This is the case 392 for event 2, which is a dry/mixed avalanche with a large 393 394aerosol part and a reduced dense body.

395Two different distance evolution profiles of the speed along the path are observed in Fig. 4, which corresponds 396 to the two distinct types of avalanche (dry/mixed and 397 wet). Interestingly, the character of the profile is 398 relatively independent of the size of the avalanche. 399 Dry/mixed avalanches have higher speeds than wet 400avalanches. If we consider the slope profile in Fig. 4 as a 401 reference curve, all speed values for dry/mixed 402 avalanches are above this curve, whereas the speeds of 403the wet avalanches are below the curve. Dry/mixed 404 405avalanches even seem to accelerate along this part of the path in some cases: The average seismic speed values 406 for the GF2-GF3 interval appear slightly higher than for 407the GF1-GF2 interval for events 1 and 4, although this is 408not the case for the radar derived speed values for these 409410events nor for the LP derived speeds for event 1. Nor is this the case for the wet avalanches where an 411 412approximately linear decrease in velocity with distance is observed. The speed values deduced from load plates 413414 are also consistent with the observations. Note that the velocity profile of event 7, which corresponds to the 415largest dry/mixed avalanche, has a shape similar to that 416 417 of the other dry/mixed avalanches, but with higher

velocities. Similar behaviour is also present in the two 418 different parts of avalanche 8. The velocity profile 419corresponding to the first part of the avalanche (8a) 420displays the behaviour of a dry/mixed avalanche 421 whereas the second part shows a velocity profile of a 422 wet avalanche, as deduced from the analysis of the 423 seismic and LP signals and corroborated by the 424 subsequent field observations. The duration of the wet 425avalanches in the area of the geophones ranges between 426 50 and 80 s. The dry/mixed avalanches are shorter and 427 their duration in the area ranges between 8 and 18 s. 428

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5. Conclusions

The determination of the speed of an avalanche using 430the generated seismic signals is possible although a prior 431 detailed seismic analysis is warranted. The complexity 432 of the ground propagation of the energy generated by 433the avalanche, which may be simulated as a non-434punctual moving source, complicates the seismic time 435series characteristics. Unlike N air pressure waves or P 436 waves, the arrival of the avalanche front does not 437 produce a characteristic, easily identifiable pattern 438which complicates the picking procedure. The pre-439selection of windows with high amplitudes in the high 440frequency content of the signal, prior to the determina-441 tion of the arrival time, proves to be a good tool for 442 seismic phase discrimination. Propagation speed can be 443 obtained from the application of picking (PK) or/and 444 cross-correlation (XC) techniques to the seismic time 445series. Moreover, these methods are not exclusive, but 446 rather complementary depending on the type of the 447 signal. 448

The averaged speeds for 11 avalanches at Ryggfonn 449calculated by applying the PK and XC methods to the 450seismic time series were compared with speed estimates 451obtained from load plates and CW-Doppler radar 452located at the site. In general, a good agreement is 453found. The discrepancies are mainly related to the 454different sensitivity of the various instruments. Velocity 455profiles along the avalanche path were analysed. The 456two types of avalanches dry/mixed and wet display two 457different types of profiles regardless of the size of the 458avalanche. The dry/mixed avalanches propagate faster 459than the wet avalanches. In two cases, their speed seems 460 to accelerate slightly before sharply decreasing. For the 461wet avalanches, the velocity decreases approximately 462linearly with distance. As regards time duration, dry/ 463mixed type avalanches are as expected shorter. Their 464 duration between the steel tower and the dam ranges 465between 8 and 18 s, whereas the duration of the wet 466 avalanches in the same area ranges between 50 and 80 s. 467

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468 No difference in the behaviour of natural and artificially469 released avalanches was observed.

470 In conclusion, the study of seismic signals enables us 471 to obtain information on the size and type of avalanches. Seismic analysis helps us to classify the avalanches and 472 473 their flow regime. Seismic methods are useful to detect avalanches and to determine their average propagation 474 475speed, although in drv/mixed avalanches with aerosol 476 and dense parts, the dense part is more readily detected. In such cases, the speed obtained corresponds to the 477 478 dense part.

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