Traffic and Quality Characterization of Scalable Encoded Video: A Large-Scale Trace-Based Study Part 4: Statistical Analysis of Spatial Scalable Encoded Video *†

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Abstract

In this part we study the traffic and quality characteristics of spatial scalable encoded videos. Six video sequences representing different genres were spatially encoded into two layers, the base layer, and the enhancement layer. Each sequences are of CIF type and 30 minutes in length. We studied the traffic and quality characteristics of base layer (QCIF), the enhancement layer (traffic only) and the aggregated layer (base + enhancement layer). A 12 frame GoP was chosen for base layer and enhancement layer, such that spatial layer GoP matches with that of single layer encodings. Our encodings with rate control have a rate-controlled base layer, while the corresponding layer is encoded without rate control. These encodings are well suited for simulating the widely advocated networking scenario with a nearly constant bit rate base layer and a variable bit rate enhancement layer. Our statistical analysis provides an insights into these layer streams and there behavior when compared to the corresponding single layer encodings. Our traffic studies shows a double "hump" in coefficient of variation and peak–to–mean ratio for both base layer traffic and the aggregated layer traffic. These peaks are centered at quantization parameter corresponding to 060810 and 101416. In most of the cases, the Hurst parameter estimated from the R/S plot, the periodogram, and the variance time plot are the same for the base layer traffic and the enhancement layer traffic. This indicates that long range dependence is not changed by scaling the input video sequence.

1 Introduction

In this part we conduct a statistical analysis of the video traffic and the video quality for the spatial scalable encoded video. This statistical analysis is based on the terse traces of the base

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layer and the corresponding enhancement layer. Recall from Part 1 that the terse traces give the frame sizes of the individual layers. In addition, the terse base layer trace gives the qualities (PSNR values) of the luminance component of the base layer stream. The terse enhancement layer trace gives the improvement in the PSNR of the luminance component achieved by the enhancement layer.

2 Analysis of Video Traffic

In this section we analyze the frame sizes (traffic) of the spatial scalable encoded videos. We first study the statistical characteristics of the base layer traffic, then the enhancement layer traffic, and finally the correlations between base layer and enhancement layer traffic. Recall that in the considered spatial scalable encodings, each frame has a base layer component and an enhancement layer component.

2.1 Base Layer Traffic

We give the compression ratios, the mean frame sizes ($\bar{X}^b$), the coefficients of variation (CoV_X^b), and the peak-to-mean ratios ($X_{\max}^b/\bar{X}^b$) in Table 1, along with the mean bit rates ($\bar{X}^b/T$), and the peak bit rates ($X_{\max}^b/T$).

It is interesting to note that the average size of a QCIF frame encoded without scalability or rate control is roughly the same size as a spatially scalable encoded frame from the base layer of the same movie in CIF format. From Table 1 of this report, as well as from Table 1 of Part 2, we observe that the relative order of the compression ratios achieved for video sequences at a given quality level is the same for both single layer encodings and encodings with spatial scalability.

The encoder used in this study was able to achieve the 128 kbps and 256 kbps target bit rates for the spatial encoding of a sequence with rate control, just as it did for single layer encodings with rate control. For a target bit rate of 64 kbps, the spatial encoder with rate control shows variations in the achieved bit rates. The encoder was able to achieve the target bit rate of 64 kbps for the *Silence of the Lambs* video sequence for both spatial and single layer encodings, whereas for the remaining three video sequences — *Terminator I*, *Snowboard with Commercials*, and *Oprah without Commercials* — the encoder achieved higher than the target 64 kbps bit rate for both the single layer and spatial encodings of the corresponding sequences in CIF format. Additionally, for these three video sequences, the bit rates achieved for a target of 64 kbps were nearly equal and have mean bitrate greater than 64kbps for the largest quantization parameter 30,30,30 when we compare single layer encodings with spatial base layer encodings.

The coefficient of variation of a single layer encoded video sequence does not appear to have a consistent relationship with the coefficient of variation of the video sequence encoded with spatial scalability. Sometimes the CoV_X^b is larger for a spatially encoded video sequence than the single layer encoding, and sometimes the CoV_X^b is larger for a single layer encoding than the video encoded with spatial scalability, although the values for the two for encodings with and without scalability are very close to one another.

When interpreting the statistics given in various tables, keep in mind that the base layer of the studied spatial scalable encoding provides the video in the QCIF format. Single layer video in the QCIF format is studied in Part 2 of this technical report. We will therefore now compare the base layer statistics here with the single layer QCIF statistics from Part 2.

We observe that the compression ratio of the base layer video is about four times larger than the compression ratios of the single layer QCIF video in Table 1 of Part 2. This is to be expected as the QCIF format has half the number of pixels as the CIF format in both the horizontal and the vertical direction. Taking a closer look at the average base layer frame size ($\bar{X}^b$) of the encodings without rate control in comparison with the corresponding average single layer QCIF frame sizes ($\bar{X}$) in Table 1 of Part 2, we observe the following.

For the high quality encodings without rate control, the $\bar{X}^b$ values of *Terminator I*, *Snowboard with Commercials*, and *Oprah without Commercials* are between 4% and 6% larger than the $\bar{X}$ values . For the medium quality, the $\bar{X}^b$ values are between 1% and 4% larger. The $\bar{X}^b$ of the high and medium quality of *Silence of the Lambs*, on the other hand, are about the same as $\bar{X}$. For the low quality encodings of *Snowboard with comm* and *Oprah w/o comm* the $\bar{X}^b$ are between 0.5% to 2% smaller than the corresponding $\bar{X}$. For *Silence of the Lambs* and *Terminator I*, $\bar{X}^b$ is nearly 1% to 4% higher than $\bar{X}$ for various quality levels.

Next, we notice that for the encodings without rate control, the behavior of the traffic variability measured in CoV_X^b and $X_{\max}^b/\bar{X}^b$ compared to CoV_X and $X_{\max}/\bar{X}$ in Table 1 of Part 2 is complementary to the behavior of the mean frame size ($\bar{X}^b$). Specifically, while the values appear to be very close, the encodings without rate control of *Terminator I*, *Snowboard with Commercials*, and *Oprah without Commercials* have usually smaller CoV_X^b and $X_{\max}^b/\bar{X}^b$ compared to CoV_X and $X_{\max}/\bar{X}$ of the corresponding single layer QCIF encodings. For *Silence of the Lambs* we do not find a consistent behavior for non-rate controlled encodings.

For encodings with rate control we observe again that the TM5 rate control matches the target bit rates of 128 kbps and 256 kbps while having problems meeting the 64 kbps target bit rate. There appears to be no clear general trend in the behavior of the variability of the base layer encodings with rate control in comparison with the variability of the corresponding single-layer QCIF encodings. Only for the 128 kbps encodings, there is a clear trend in that the base layer encodings have smaller CoV_X^b and $X_{\max}^b/\bar{X}^b$. For the other quality levels we observe conflicting trends in CoV_X^b and $X_{\max}^b/\bar{X}^b$. For the 256 kbps encodings for instance, CoV_X^b is smaller than CoV_X, while there is no clear trend in the behavior of $X_{\max}^b/\bar{X}^b$ with respect to $X_{\max}/\bar{X}$.

Considering the base layer traffic for the different quality levels without rate control, we observe a double "hump" behavior of first increasing and then decreasing variability as the quality level decreases. The first hump is observed at 060810 and the second hump at M.Q.

Table 2 gives the mean GoP size $\bar{Y}^b$, the coefficient of variation of the GoP sizes CoV_Y^b, and the Peak-to-Mean ratio $Y_{\max}^b/\bar{Y}^b$ of the GoP sizes, as well as the Peak bit rate $Y_{\max}^b/(GT)$ of the GoP trace.

We observe that the $Y_{\max}^b/\bar{Y}^b$ and $Y_{\max}^b/(GT)$ values for the base layer encodings without rate control are consistently smaller than the $Y_{\max}/\bar{Y}$ and $Y_{\max}/(GT)$ values in Table 2 of Part 2. On the other hand, there appears to be no clear trend in the correlation of the behavior of CoV_Y^b in comparison with the corresponding single layer CoV_Y.

For the encodings without rate control, we observe that $Y_{\max}^b/\bar{Y}^b$ is largest for medium quality (quantization parameter ranging from 101010 to 101416) than any other quality encoded video. CoV_Y^b is largest for the H.M quality level encoded videos when compared with other encodings with and without rate control. The behavior of $Y_{\max}^b/\bar{Y}^b$ and CoV_Y^b is the same as was observed earlier several times i.e., we find a "hump" where the peak is centered around the medium quality encoding. The variability of the GoP size for the medium quality traces is greater than the variability of the GoP size for both the high and low quality traces. This observation can also be made from Figure 4, which shows the GoP size histograms. The medium quality encoding of *Snowboard with Commercials* has a much wider histogram, than either of the two histogram plots of the high quality *Silence of the Lambs*, or the low quality *Oprah without Commercials*.

For the rate-controlled sequences, $Y_{\max}^b/\bar{Y}^b$ are largest for videos encoded with 64 kbps and 128 kbps target bits when compared to 256 kbps target bit rate encoded videos. However the peak-to-mean ratios do not exhibit a consistent relationship when compared for the 64 kbps and 128 kbps target bit rates. We observe that CoV_Y^b are largest for the encodings with a target bit rate of 64 kbps, followed by 128 kbps, and have the smallest values for the sequences with a target bit rate of 256 kbps. These values imply that the encodings with a target bit rate of 64 kbps have more GoP size variability than encodings with a target bit rate of 128 kbps, which in turn have more GoP size variability than encodings with a target bit rate of 256 kbps. This can also be observed in Figure 4, which, as was mentioned above, gives the GoP size histograms. While it is difficult to observe the difference in the variability of the 128 kbps and 256 kbps encodings of *Snowboard with Commercials* and *Silence of the Lambs* — they both appear to be very sharp — the 64 kbps encoding of *Oprah without Commercials* has a much duller peak than these other two histograms. Also, we observe that the 128 kbps and 256 kbps base layer encodings have typically somewhat smaller peak-to-mean ratios and peak bit rates than the corresponding single layer encodings.

The GoP level peak-to-mean ratio ($Y_{\max}/\bar{Y}$) and the coefficient of variation (CoV_Y^b) of spatially scalable encoded CIF video sequences decreases because as the aggregation level increases, the encoded frame sizes traffic becomes more smooth. We observe that for a given video, the mean GoP size of the base layer of the spatial encoding is nearly equal to the mean GoP size of the single layer encoding (QCIF).

The effect of the source video quality can have a severe impact on the compression ratios as is observed with *LectureHQ-Reisslein*. The poorer the source sequence video quality, the smaller the compression ratio achieved for the same quality encoding. This ratio can vary from 3 for high quality encoding to nearly 2 for low quality encoding. This is due to the fact that the existing compression algorithms try to exploit the high degree of correlation in neighboring pixels. Noisy video sequences tend to have small correlation of neighboring pixels, thus severely effecting the compression ratios. The coefficient of variation is smaller for the base layer of the spatial encoded video when compared with the single layer encoded video (QCIF). However, we do not observe any consistent trend in peak-to-mean ratios. The peak bit rates of spatially encoded CIF video sequences are smaller than the peak bit rates of the single layer encodings of QCIF video sequences. This difference can range anywhere from zero to around 600 kbps.

The CoV_X^b decreases for all spatially encoded CIF video sequences at the target bit rates of 128 kbps and 256 kbps when compared to the single layer encoded QCIF video sequences. For other encoding modes, the CoV_X^b has no consistent relation between single layer and spatial scalable encodings. The peak-to-mean ratio is smaller in the spatial encodings than for the single layer encodings at the GoP level for almost all video sequences as well as for all the encoding modes.

Table 1: Overview of frame statistics of the base layer of spatial scalable encoded video

		Compr.	Frame Size			Bit Rate	
		Ratio	Mean	CoV	Peak/Mean	Mean	Peak
Enc. M.	Video	YUV:BL	$\bar{X}^b$ [kbyte]	CoV_X^b	$X_{\max}^b/\bar{X}^b$	$\bar{X}^b/T$ [Mbps]	$X_{\max}^b/T$ [Mbps]
CIF	*Silence of the Lambs*	81.406	1.868	0.831	8.849	0.448	3.967
H.Q.	*Terminator One*	48.922	3.108	0.599	4.780	0.746	3.566
No R.C.	*Snowboard with Comm*	31.018	4.902	0.463	4.647	1.177	5.468
	Oprah w/o Comm	25.965	5.857	0.343	2.841	1.406	3.994
	LectureHQ-Reisslein	72.205	2.106	0.712	6.719	0.505	3.396
	ParkingLot	25.507	5.962	0.541	3.167	1.431	4.532
CIF	*Silence of the Lambs*	173.185	0.878	1.588	16.427	0.211	3.462
040608.Q.	*Terminator One*	95.226	1.597	1.107	8.353	0.383	3.201
No R.C.	*Snowboard with Comm*	63.441	2.397	0.957	6.524	0.575	3.753

Table 1: *continued*

	Oprah w/o Comm	57.657	2.637	0.913	5.413	0.633	3.426
	LectureHQ-Reisslein	147.682	1.030	1.694	13.743	0.247	3.396
	ParkingLot	48.921	3.108	1.047	4.784	0.746	3.569
CIF	*Silence of the Lambs*	258.342	0.589	1.630	18.917	0.141	2.672
060810.Q.	*Terminator One*	134.163	1.133	1.110	8.915	0.272	2.425
No R.C.	*Snowboard with Comm*	92.221	1.649	0.997	7.371	0.396	2.917
	Oprah w/o Comm	89.636	1.696	0.994	6.362	0.407	2.590
	LectureHQ-Reisslein	212.755	0.715	1.811	15.411	0.172	2.644
	ParkingLot	68.166	2.231	1.115	5.137	0.535	2.750
CIF	*Silence of the Lambs*	307.831	0.494	1.316	15.602	0.119	1.850
H.M.Q.	*Terminator One*	154.494	0.984	0.841	7.071	0.236	1.670
No.R.C.	*Snowboard with Comm*	108.287	1.404	0.782	7.376	0.337	2.486
	Oprah w/o Comm	111.503	1.364	0.688	5.417	0.327	1.773
	LectureHQ-Reisslein	250.216	0.608	1.390	12.795	0.146	1.866
	ParkingLot	77.709	1.957	0.893	4.523	0.470	2.124
CIF	*Silence of the Lambs*	450.352	0.338	1.691	22.825	0.081	1.850
M.Q.	*Terminator One*	237.519	0.640	1.219	10.468	0.154	1.608
No.R.C.	*Snowboard with Comm*	177.590	0.856	1.216	9.896	0.206	2.034
	Oprah w/o Comm	198.863	0.765	1.318	9.411	0.184	1.727
	LectureHQ-Reisslein	375.065	0.405	2.183	19.179	0.097	1.866
	ParkingLot	127.185	1.196	1.397	6.620	0.287	1.900
CIF	*Silence of the Lambs*	652.895	0.233	1.076	14.778	0.056	0.826
M.L.Q.	*Terminator One*	386.732	0.393	0.859	7.508	0.094	0.708
No.R.C.	*Snowboard with Comm*	314.815	0.483	0.939	7.913	0.116	0.917
	Oprah w/o Comm	416.413	0.365	0.953	8.037	0.088	0.704
	LectureHQ-Reisslein	651.441	0.233	1.615	15.354	0.056	0.860
	ParkingLot	248.430	0.612	1.206	5.702	0.147	0.838
CIF	*Silence of the Lambs*	697.834	0.218	0.905	12.156	0.052	0.636
L.Q.	*Terminator One*	450.956	0.337	0.786	6.833	0.081	0.553
No.R.C.	*Snowboard with Comm*	389.689	0.390	0.896	7.660	0.094	0.717
	Oprah w/o Comm	546.299	0.278	0.945	7.943	0.067	0.531
	LectureHQ-Reisslein	755.253	0.201	1.423	13.817	0.048	0.668
	ParkingLot	330.117	0.461	1.213	5.922	0.111	0.655
CIF	*Silence of the Lambs*	560.939	0.271	1.156	32.089	0.065	2.088
64 kbps	*Terminator One*	456.386	0.333	0.773	6.792	0.080	0.543
R.C.	*Snowboard with Comm*	397.668	0.382	0.883	12.077	0.092	1.108
	Oprah w/o Comm	544.739	0.279	0.920	17.883	0.067	1.198
	LectureHQ-Reisslein	568.990	0.267	2.107	22.267	0.064	1.428
	ParkingLot	340.570	0.446	1.200	5.888	0.107	0.631
CIF	*Silence of the Lambs*	284.834	0.534	1.092	16.238	0.128	2.081
128 kbps	*Terminator One*	284.803	0.534	1.042	22.556	0.128	2.890
R.C.	*Snowboard with Comm*	284.821	0.534	1.087	20.429	0.128	2.618
	Oprah w/o Comm	284.817	0.534	1.210	13.641	0.128	1.748
	LectureHQ-Reisslein	284.829	0.534	1.772	11.533	0.128	1.478
	ParkingLot	284.399	0.535	1.549	46.579	0.128	5.977
CIF	*Silence of the Lambs*	142.492	1.067	0.890	9.256	0.256	2.371
256 kbps	*Terminator One*	142.493	1.067	0.962	9.506	0.256	2.435
R.C.	*Snowboard with Comm*	142.497	1.067	0.979	11.730	0.256	3.004
	Oprah w/o Comm	142.491	1.067	0.987	7.547	0.256	1.933
	LectureHQ-Reisslein	142.492	1.067	1.283	10.025	0.256	2.568
	ParkingLot	142.490	1.067	1.494	14.739	0.256	3.775

Table 2: Overview of GoP statistics of the base layer of spatial scalable encoded video

		GoP Size			Bit Rate
		Mean	CoV	Peak/Mean	Peak
Enc. M.	Video	$\bar{Y}^b$ [kbyte]	CoV_Y^b	$Y_{\max}^b/\bar{Y}^b$	$Y_{\max}^b/(GT)$ [Mbps]
CIF	*Silence of the Lambs*	22.416	0.658	6.820	3.057
H.Q.	*Terminator One*	37.300	0.427	2.920	2.178
No.R.C.	*Snowboard with Comm*	58.828	0.369	2.691	3.166
	Oprah w/o Comm	70.279	0.258	1.899	2.669
	LectureHQ-Reisslein	25.272	0.245	2.780	1.405
	ParkingLot	71.541	0.408	2.348	3.360
CIF	*Silence of the Lambs*	10.537	0.777	9.078	1.913
040608.Q.	*Terminator One*	19.162	0.458	3.216	1.232
No R.C.	*Snowboard with Comm*	28.763	0.440	3.065	1.763
	Oprah w/o Comm	31.649	0.292	2.264	1.433
	LectureHQ-Reisslein	12.356	0.284	3.185	0.787
	ParkingLot	37.300	0.500	2.809	2.095
CIF	*Silence of the Lambs*	7.063	0.866	10.656	1.505
060810.Q.	*Terminator One*	13.601	0.478	3.371	0.917
No.R.C.	*Snowboard with Comm*	19.787	0.489	3.393	1.343
	Oprah w/o Comm	20.358	0.314	2.516	1.025
	LectureHQ-Reisslein	8.577	0.308	3.371	0.578
	ParkingLot	26.770	0.546	3.092	1.656
CIF	*Silence of the Lambs*	5.928	0.922	11.549	1.369
H.M.Q.	*Terminator One*	11.811	0.486	3.380	0.799
No.R.C.	*Snowboard with Comm*	16.851	0.521	3.624	1.221
	Oprah w/o Comm	16.365	0.333	2.706	0.886
	LectureHQ-Reisslein	7.293	0.322	3.456	0.504
	ParkingLot	23.482	0.565	3.197	1.501
CIF	*Silence of the Lambs*	4.052	0.819	11.032	0.894
M.Q.	*Terminator One*	7.683	0.455	3.279	0.504
No.R.C.	*Snowboard with Comm*	10.275	0.515	3.737	0.768
	Oprah w/o Comm	9.176	0.315	2.727	0.501
	LectureHQ-Reisslein	4.865	0.299	3.306	0.322
	ParkingLot	14.347	0.560	3.475	0.997
CIF	*Silence of the Lambs*	2.795	0.638	8.880	0.496
M.L.Q.	*Terminator One*	4.718	0.404	2.989	0.282
No.R.C.	*Snowboard with Comm*	5.796	0.470	3.608	0.418
	Oprah w/o Comm	4.382	0.327	2.910	0.255
	LectureHQ-Reisslein	2.801	0.252	3.163	0.177
	ParkingLot	7.345	0.584	3.840	0.564
CIF	*Silence of the Lambs*	2.615	0.523	7.032	0.368
L.Q.	*Terminator One*	4.046	0.370	2.753	0.223
No.R.C.	*Snowboard with Comm*	4.683	0.430	3.448	0.323
	Oprah w/o Comm	3.340	0.318	2.875	0.192
	LectureHQ-Reisslein	2.416	0.212	2.963	0.143
	ParkingLot	5.528	0.551	3.833	0.424
CIF	*Silence of the Lambs*	3.253	0.386	7.036	0.458
64 kbps	*Terminator One*	3.998	0.361	2.704	0.216
R.C.	*Snowboard with Comm*	4.589	0.421	3.392	0.311
	Oprah w/o Comm	3.350	0.300	4.575	0.307
	LectureHQ-Reisslein	3.207	0.144	3.785	0.243
	ParkingLot	5.358	0.545	3.813	0.409
CIF	*Silence of the Lambs*	6.406	0.116	4.754	0.609
128 kbps	*Terminator One*	6.407	0.159	3.562	0.456
R.C.	*Snowboard with Comm*	6.407	0.256	4.275	0.548
	Oprah w/o Comm	6.407	0.076	1.923	0.246
	LectureHQ-Reisslein	6.407	0.039	1.427	0.183
	ParkingLot	6.416	0.515	4.685	0.601
CIF	*Silence of the Lambs*	12.806	0.033	1.537	0.394
256 kbps	*Terminator One*	12.806	0.040	1.306	0.334
R.C.	*Snowboard with Comm*	12.806	0.054	1.481	0.379
	Oprah w/o Comm	12.806	0.022	1.213	0.311

Table 2: *continued*

LectureHQ-Reisslein	12.806	0.036	1.300	0.333
ParkingLot	12.806	0.081	2.410	0.617

Figure 1 gives frame sizes X_n^b (in bytes) as a function of the frame number n. We observe from these plots that the encodings without rate control generate highly variable frame sizes that are characteristic of open-loop video encodings. The encodings with rate control appear generally less variable. However, there are occasionally very large spikes in the frame sizes, which appear to be the reason for the relatively large CoV_X^b and $X_{\max}^b/\bar{X}^b$ observed in Table 1.

Figure 2 gives the GoP size Y_m^b (in bytes) as a function of the GoP number m. From Figure 2 we observe the variability of the GoP sizes that we described above.

Figure 3 gives the histograms of the frame sizes X_n^b. The histograms of the base layer frame sizes look fairly similar to the QCIF single layer frame size histograms in Figure 3 of Part 2, except for the absence of the second "bump" at large frame sizes in most of the base layer histograms.

The effectiveness of the rate control scheme employed in this investigation can be observed from the histogram plots shown in Figure 3. As the target bit rate increases from 64 kbps to 256 kbps, the histograms become narrower, and the peaks become sharper indicating that more frames are concentrated in a small range around the target bit rate. This range decreases as the target bit rate increases. This shows that as the target bit rate increases CoV_X^b decreases, as we have already observed. An ideal rate-controlled sequence would have a frame size histogram plot represented by an impulse at the target average frame size, which can be derived from desired target bit rate. From these histogram plots we observe that the high quality encoding of *Silence of the Lambs* has a broad distribution as well as a longer distribution tail than the low quality encoding of *Oprah without Commercials*, which has a narrower frame distribution and a shorter distribution tail.

It is interesting to note that *Oprah without Commercials* has different frame size distributions. All of the plots have multiple peaks meaning that the frame sizes are concentrated into multiple set of predominant ranges. This distinct set of frame sizes are clearly visible from the GoP size trace plots in Figure 2. The *Oprah without Commercials* GoP size plot shows a large number of rectangular regions, which look like small rectangular wells in the plot, and which correspond to a roughly constant frame size. This leads to multiple peaks in the histogram plot. The same phenomenon is observed in the histogram and frame size trace plots of the single layer encoding of *Lecture–Reisslein.* This behavior appears to be due to the video content, where both sequences have something in common i.e., in both there are only infrequent scene changes unlike in sports or commercials films.

Figure 5 gives the autocorrelation coefficient $\rho_X^b(k)$ of the frame size sequence $X_n^b,\ n = 0,\ldots,N-1$, as a function of the lag k (in frames). The large peaks, spaced 12 frames apart in these autocorrelation functions, are again due to the I-I/P-P correlations discussed in Part

1. The smaller peaks spaced 3 frames apart are due to the I-P/P-P frame size correlations. For the low quality and 64 kbps target bit rate these smaller peaks are not present. This is because the P and B frames tend to have the same sizes in these encodings.

The peaks in Figure 5 correspond to the large I frame sizes which are separated by a 12 frame period lag in the base layer. The autocorrelation function slope tends to be constant (roughly zero) for rate controlled video encoded sequences. This is because of nearly constant frame sizes in base layer. For our encodings rate control in applied only for base layer, enhancement layer for our encodings is non-rate controlled.

Figure 6 gives the autocorrelation coefficient $\rho_{Y^b}(k)$ of the GoP size sequence $Y_m^b,\ m = 0, \ldots, N/G-1$, as a function of the lag k (in GoPs). Remarkable is the large autocorrelation between 0.4 and 0.5 for lags up to 100 GoPs of the high quality *Silence of the Lambs* base layer. The autocorrelation coefficient for the base layer frame size trace at the GoP level decreases sharply for video sequences encoded at target bit rates of 256 kbps and 128 kbps. The autocorrelation drops to zero for lags of 20 GoPs. However, it takes lag periods of around 80 GoPs to bring the autocorrelation to nearly zero for target bit rate of 64 kbps. We find random fluctuations in the GoP level autocorrelation function for all rate controlled encoded sequences which is not observed in non-rate controlled encoded sequences. The same phenomenon was observed in single layer encoded sequences.

Table 3 gives the Hurst parameter determined with the R/S method (the first line of the given video and encoding mode) and the periodogram (the second line of the given video and encoding mode) for $X_n^b,\ n = 0, \ldots, N-1$, as a function of the aggregation level a.

Table 3: Hurst parameters estimated from pox diagram of R/S and periodogram as a function of the aggregation level a for base layer traffic.

		Aggregation level a [frames]										
Enc. M.	Video	12	24	48	96	192	300	396	504	600	696	792
CIF	*Silence of the Lambs*	0.916	0.898	0.897	0.927	0.968	0.927	0.959	0.825	0.870	0.897	0.836
H.Q.	*Silence of the Lambs*	1.211	1.241	1.160	1.051	1.114	1.135	1.049	1.141	1.053	1.024	1.183
No.R.C.	*Terminator One*	0.834	0.834	0.820	0.822	0.813	0.854	0.908	0.908	0.923	0.939	0.930
	Terminator One	1.158	1.108	1.031	0.938	0.935	0.772	0.822	0.761	0.715	0.800	0.752
	Snowboard with Comm	0.727	0.695	0.645	0.598	0.605	0.606	0.586	0.622	0.583	0.546	0.616
	Snowboard with Comm	1.192	1.087	0.820	0.805	0.791	0.678	0.539	0.556	0.617	0.564	0.463
	Oprah w/o Comm	0.878	0.856	0.840	0.843	0.850	0.878	0.836	0.807	0.904	0.724	0.817
	Oprah w/o Comm	1.217	1.242	1.222	1.127	1.095	1.008	1.203	1.098	1.034	1.153	0.940
	LectureHQ-Reisslein	0.856	0.849	0.836	0.841	0.837	0.855	0.920	0.880	0.909	0.904	0.921
	LectureHQ-Reisslein	1.128	1.091	1.033	1.067	0.983	0.960	0.987	0.894	0.824	0.803	0.764
	ParkingLot	0.413	0.370	0.390	0.431	0.469	0.499	0.540	0.673	0.748	0.719	0.742
	ParkingLot	0.954	0.732	0.586	0.394	0.499	0.332	0.410	0.410	0.416	0.525	0.469
CIF	*Silence of the Lambs*	0.928	0.896	0.890	0.925	0.956	0.914	0.921	0.825	0.857	0.898	0.832
040608.Q.	*Silence of the Lambs*	1.136	1.212	1.167	1.049	1.074	1.120	1.041	1.120	1.031	1.015	1.186
No.R.C.	*Terminator One*	0.824	0.820	0.807	0.808	0.802	0.854	0.910	0.909	0.920	0.964	0.959
	Terminator One	1.125	1.098	1.023	0.926	0.921	0.767	0.838	0.742	0.692	0.813	0.732
	Snowboard with Comm	0.743	0.719	0.672	0.614	0.598	0.616	0.583	0.636	0.555	0.533	0.560
	Snowboard with Comm	1.172	1.084	0.850	0.833	0.807	0.705	0.592	0.634	0.700	0.661	0.533
	Oprah w/o Comm	0.868	0.838	0.815	0.812	0.818	0.833	0.775	0.758	0.847	0.665	0.748
	Oprah w/o Comm	1.169	1.214	1.203	1.107	1.065	0.978	1.145	1.090	0.942	1.112	0.903
	LectureHQ-Reisslein	0.862	0.851	0.841	0.845	0.853	0.882	0.924	0.908	0.944	0.977	0.994
	LectureHQ-Reisslein	1.107	1.068	1.017	1.054	0.986	0.967	1.006	0.938	0.873	0.887	0.840
	ParkingLot	0.384	0.336	0.349	0.393	0.435	0.470	0.516	0.649	0.708	0.665	0.696
	ParkingLot	0.941	0.723	0.568	0.343	0.436	0.278	0.369	0.376	0.330	0.459	0.386
CIF	*Silence of the Lambs*	0.931	0.898	0.888	0.920	0.939	0.896	0.905	0.818	0.834	0.895	0.830
060810.Q.	*Silence of the Lambs*	1.098	1.177	1.169	1.044	1.052	1.101	1.024	1.137	1.013	1.029	1.197
No.R.C.	*Terminator One*	0.823	0.813	0.801	0.800	0.797	0.853	0.903	0.904	0.922	0.966	0.961
	Terminator One	1.105	1.091	1.015	0.916	0.907	0.761	0.848	0.731	0.677	0.811	0.717
	Snowboard with Comm	0.750	0.726	0.682	0.619	0.600	0.617	0.582	0.640	0.547	0.537	0.536
	Snowboard with Comm	1.153	1.083	0.875	0.863	0.816	0.700	0.625	0.641	0.729	0.675	0.557

Table 3: *continued*

Enc. M.	Video	Aggregation level a [frames] 12	24	48	96	192	300	396	504	600	696	792
	Oprah w/o Comm	0.859	0.827	0.795	0.780	0.783	0.794	0.730	0.731	0.809	0.633	0.674
	Oprah w/o Comm	1.139	1.192	1.184	1.085	1.062	0.967	1.113	1.118	0.905	1.075	0.878
	LectureHQ-Reisslein	0.867	0.856	0.852	0.855	0.861	0.890	0.929	0.915	0.952	1.005	1.028
	LectureHQ-Reisslein	1.096	1.063	1.012	1.044	0.981	0.984	1.012	0.947	0.889	0.916	0.863
	ParkingLot	0.371	0.321	0.329	0.375	0.424	0.449	0.500	0.626	0.686	0.631	0.666
	ParkingLot	0.936	0.714	0.546	0.334	0.402	0.252	0.342	0.371	0.278	0.397	0.336
CIF	*Silence of the Lambs*	0.935	0.902	0.893	0.921	0.930	0.892	0.901	0.816	0.813	0.894	0.837
H.M.Q.	*Silence of the Lambs*	1.083	1.166	1.148	1.033	1.045	1.104	1.010	1.111	1.013	1.029	1.194
No.R.C.	*Terminator One*	0.821	0.809	0.798	0.797	0.794	0.857	0.898	0.899	0.925	0.965	0.964
	Terminator One	1.099	1.092	1.012	0.909	0.890	0.760	0.835	0.725	0.671	0.818	0.713
	Snowboard with Comm	0.755	0.731	0.689	0.626	0.605	0.619	0.584	0.638	0.546	0.543	0.532
	Snowboard with Comm	1.138	1.087	0.887	0.881	0.839	0.704	0.656	0.664	0.767	0.699	0.611
	Oprah w/o Comm	0.848	0.813	0.783	0.760	0.757	0.766	0.701	0.695	0.770	0.619	0.649
	Oprah w/o Comm	1.133	1.184	1.185	1.073	1.053	0.960	1.086	1.081	0.877	1.057	0.854
	LectureHQ-Reisslein	0.867	0.859	0.857	0.857	0.854	0.887	0.907	0.891	0.923	0.980	1.013
	LectureHQ-Reisslein	1.096	1.062	1.016	1.034	0.972	0.981	0.992	0.921	0.887	0.897	0.830
	ParkingLot	0.367	0.317	0.326	0.370	0.427	0.453	0.503	0.631	0.694	0.649	0.674
	ParkingLot	0.939	0.710	0.537	0.334	0.389	0.249	0.345	0.388	0.257	0.388	0.332
CIF	*Silence of the Lambs*	0.937	0.914	0.908	0.924	0.906	0.871	0.880	0.791	0.791	0.884	0.823
M.Q.	*Silence of the Lambs*	1.046	1.130	1.127	1.016	1.023	1.075	0.989	1.072	1.002	1.027	1.180
No.R.C.	*Terminator One*	0.813	0.796	0.784	0.779	0.776	0.842	0.877	0.893	0.922	0.963	0.951
	Terminator One	1.062	1.078	0.995	0.890	0.873	0.755	0.762	0.713	0.642	0.807	0.683
	Snowboard with Comm	0.759	0.734	0.690	0.622	0.602	0.616	0.577	0.622	0.519	0.531	0.471
	Snowboard with Comm	1.105	1.070	0.903	0.883	0.836	0.580	0.646	0.607	0.668	0.617	0.576
	Oprah w/o Comm	0.858	0.818	0.779	0.757	0.749	0.729	0.690	0.685	0.731	0.614	0.638
	Oprah w/o Comm	1.065	1.134	1.148	1.053	1.062	0.950	1.069	1.036	0.859	1.068	0.845
	LectureHQ-Reisslein	0.867	0.858	0.852	0.850	0.847	0.865	0.887	0.893	0.906	0.977	1.006
	LectureHQ-Reisslein	1.081	1.048	1.019	1.057	0.997	1.010	1.034	0.960	0.920	0.950	0.913
	ParkingLot	0.356	0.303	0.310	0.358	0.429	0.437	0.494	0.616	0.676	0.606	0.673
	ParkingLot	0.942	0.705	0.528	0.311	0.370	0.222	0.321	0.358	0.265	0.343	0.282
CIF	*Silence of the Lambs*	0.919	0.907	0.900	0.911	0.880	0.828	0.861	0.744	0.758	0.876	0.819
M.L.Q.	*Silence of the Lambs*	0.999	1.101	1.095	1.015	1.023	1.036	0.914	0.950	0.952	1.085	1.071
No.R.C.	*Terminator One*	0.797	0.779	0.768	0.759	0.763	0.807	0.830	0.840	0.890	0.905	0.906
	Terminator One	1.013	1.039	0.990	0.896	0.877	0.720	0.701	0.739	0.603	0.732	0.693
	Snowboard with Comm	0.773	0.741	0.698	0.637	0.623	0.604	0.599	0.606	0.500	0.547	0.436
	Snowboard with Comm	1.060	1.040	0.927	0.932	0.873	0.684	0.684	0.603	0.723	0.671	0.584
	Oprah w/o Comm	0.851	0.839	0.815	0.789	0.789	0.721	0.696	0.678	0.688	0.546	0.626
	Oprah w/o Comm	0.969	1.053	1.096	1.032	1.087	0.985	1.052	1.042	0.885	1.017	0.930
	LectureHQ-Reisslein	0.833	0.815	0.800	0.784	0.755	0.716	0.737	0.745	0.725	0.735	0.778
	LectureHQ-Reisslein	1.030	1.012	0.967	0.989	0.942	0.885	0.920	0.926	0.863	0.855	0.774
	ParkingLot	0.340	0.285	0.290	0.331	0.440	0.466	0.513	0.637	0.701	0.628	0.729
	ParkingLot	0.930	0.688	0.491	0.237	0.318	0.178	0.325	0.395	0.279	0.367	0.414
CIF	*Silence of the Lambs*	0.911	0.898	0.902	0.892	0.864	0.814	0.857	0.738	0.749	0.852	0.816
L.Q.	*Silence of the Lambs*	0.984	1.073	1.065	0.997	1.018	1.023	0.900	0.903	0.950	1.090	1.027
No.R.C.	*Terminator One*	0.787	0.771	0.762	0.741	0.741	0.786	0.794	0.816	0.866	0.869	0.884
	Terminator One	1.001	1.021	0.970	0.905	0.889	0.743	0.687	0.770	0.616	0.733	0.681
	Snowboard with Comm	0.778	0.744	0.704	0.651	0.642	0.609	0.638	0.583	0.521	0.582	0.462
	Snowboard with Comm	1.043	1.028	0.920	0.916	0.889	0.671	0.642	0.604	0.710	0.665	0.585
	Oprah w/o Comm	0.816	0.808	0.783	0.760	0.742	0.725	0.702	0.651	0.663	0.571	0.646
	Oprah w/o Comm	0.933	1.004	1.060	0.989	1.056	0.977	0.966	0.976	0.862	0.913	0.948
	LectureHQ-Reisslein	0.832	0.817	0.798	0.784	0.762	0.749	0.741	0.773	0.797	0.757	0.784
	LectureHQ-Reisslein	0.998	0.995	0.981	1.005	0.965	0.902	0.986	0.954	0.885	0.861	0.788
	ParkingLot	0.335	0.277	0.276	0.312	0.416	0.487	0.502	0.625	0.684	0.619	0.746
	ParkingLot	0.936	0.693	0.497	0.188	0.290	0.123	0.338	0.337	0.283	0.451	0.432
CIF	*Silence of the Lambs*	0.791	0.780	0.781	0.759	0.726	0.776	0.733	0.721	0.827	0.797	0.756
64 kbps	*Silence of the Lambs*	0.886	0.951	0.977	0.961	0.934	1.051	0.798	0.821	0.851	0.824	1.033
R.C.	*Terminator One*	0.793	0.776	0.762	0.741	0.736	0.776	0.777	0.805	0.857	0.854	0.866
	Terminator One	0.998	1.016	0.969	0.908	0.912	0.776	0.714	0.753	0.631	0.738	0.692
	Snowboard with Comm	0.777	0.741	0.703	0.652	0.644	0.611	0.639	0.586	0.533	0.577	0.471
	Snowboard with Comm	1.035	1.020	0.918	0.922	0.864	0.667	0.637	0.612	0.703	0.671	0.584
	Oprah w/o Comm	0.825	0.791	0.786	0.742	0.697	0.658	0.647	0.610	0.594	0.553	0.533
	Oprah w/o Comm	0.898	0.939	1.000	0.922	0.956	0.866	0.808	0.852	0.683	0.699	0.631
	LectureHQ-Reisslein	0.487	0.490	0.526	0.517	0.495	0.438	0.428	0.402	0.415	0.434	0.466
	LectureHQ-Reisslein	0.647	0.592	0.667	0.564	0.476	0.168	0.158	-0.008	-0.013	0.062	0.039
	ParkingLot	0.330	0.273	0.270	0.302	0.403	0.480	0.486	0.600	0.655	0.615	0.737
	ParkingLot	0.934	0.677	0.484	0.157	0.301	0.132	0.360	0.323	0.268	0.416	0.437
CIF	*Silence of the Lambs*	0.475	0.488	0.495	0.482	0.456	0.495	0.395	0.419	0.497	0.484	0.464
128 kbps	*Silence of the Lambs*	0.809	0.985	1.041	0.919	0.854	0.576	0.158	0.345	-0.072	-0.019	-0.243
R.C.	*Terminator One*	0.456	0.465	0.453	0.440	0.396	0.371	0.336	0.527	0.378	0.420	0.329
	Terminator One	0.666	0.612	0.454	0.277	0.026	-0.089	-0.173	-0.162	-0.020	-0.186	-0.291
	Snowboard with Comm	0.581	0.573	0.576	0.552	0.538	0.451	0.450	0.523	0.439	0.456	0.413
	Snowboard with Comm	0.774	0.722	0.661	0.568	0.627	0.526	0.236	0.104	0.038	-0.022	-0.056
	Oprah w/o Comm	0.443	0.437	0.418	0.450	0.454	0.409	0.546	0.396	0.590	0.327	0.466
	Oprah w/o Comm	0.533	0.451	0.278	0.021	-0.090	-0.023	-0.105	-0.147	0.055	0.126	-0.466
	LectureHQ-Reisslein	0.364	0.398	0.430	0.433	0.395	0.534	0.553	0.405	0.546	0.531	0.570
	LectureHQ-Reisslein	0.101	0.015	-0.076	-0.025	0.162	0.130	0.206	-0.009	0.074	0.072	0.258
	ParkingLot	0.289	0.244	0.226	0.201	0.257	0.220	0.266	0.270	0.288	0.345	0.436
	ParkingLot	0.559	0.406	0.311	0.132	0.175	-0.044	-0.037	-0.196	0.029	-0.100	0.177
CIF	*Silence of the Lambs*	0.367	0.411	0.322	0.354	0.432	0.363	0.431	0.650	0.957	0.633	1.123
256 kbps	*Silence of the Lambs*	0.443	0.481	0.391	0.131	-0.142	0.010	-0.026	-0.271	0.120	-0.013	0.283
R.C.	*Terminator One*	0.287	0.300	0.321	0.288	0.310	0.395	0.541	0.349	0.531	0.657	0.797
	Terminator One	-0.039	-0.045	-0.073	-0.112	-0.022	0.188	0.029	-0.091	0.359	0.181	0.099
	Snowboard with Comm	0.382	0.386	0.323	0.408	0.429	0.344	0.414	0.365	0.446	0.509	0.548

Table 3: *continued*

Enc. M.	Video	Aggregation level a [frames] 12	24	48	96	192	300	396	504	600	696	792
	Snowboard with Comm	0.185	0.066	-0.104	0.030	-0.166	-0.102	-0.003	-0.131	0.008	-0.118	0.124
	Oprah w/o Comm	0.309	0.342	0.385	0.381	0.439	0.591	0.823	0.885	0.887	0.799	1.254
	Oprah w/o Comm	0.012	0.023	-0.029	-0.040	0.024	0.251	0.248	0.264	0.276	0.169	0.585
	LectureHQ-Reisslein	0.222	0.226	0.235	0.233	0.314	0.386	0.445	0.378	0.624	0.634	0.819
	LectureHQ-Reisslein	-0.025	-0.086	-0.108	-0.109	0.037	0.092	0.053	0.039	0.126	0.109	-0.009
	ParkingLot	0.379	0.380	0.384	0.373	0.276	0.437	0.353	0.307	0.415	0.426	0.291
	ParkingLot	0.413	0.262	-0.023	-0.132	-0.128	-0.203	-0.115	-0.070	-0.151	0.028	-0.015

Long range dependence is measured in terms of the Hurst parameter (H), which lies in the range of $0.5 \leq H \leq 1$. A Hurst parameter value of 0.5 means that the sequence does not have long range dependence; a value of $0.5 < H < 0.75$ indicates weak long range dependence and a value of $0.75 < H \leq 1$ indicates strong long range dependence. Generally speaking, a larger H means stronger long range dependence. Estimates of long range dependence are more accurate when taken at higher aggregation levels a, typically $a > 192$. Thus, any comparisons that are made with the Hurst parameter need to be made with estimates at aggregation levels $a > 192$. See [1] and [2] for more information about the Hurst parameter.

The long range dependence behavior is same as was found in the single layer encoded video sequences discussed in Part2 of the technical report series. From Table 3 we observe that, as the aggregation level increases for a given quality level, the H estimates tend to oscillate. We further observe that the H estimates of a video trace for different quality levels do not show a consistent behavior. Some show decreasing H estimates as the quality decreases (*Silence of the Lambs*), whereas others show a oscillatory behavior. However, we observe that as the quality level changes, there is a small change in H estimate and practically this change is negligible concluding that long range dependence cannot be changed by changing the quality level of encodings; it rather appears to be a property of the source video sequence. Of all the sequences, *ParkingLot* is the only sequence which does not exhibit long range dependence (H estimate is around 0.5). This can also be concluded from the nearly exponential decay of the autocorrelation plot of the frame sizes. *Snowboard with Comm* exhibits a weak long range dependence with $H = 0.6$ as frame size autocorrelation plots show a nearly exponential decay.

For rate control encodings, we conclude that there is no long range dependence for target bit rates of 128 kbps and 256 kbps as $H < 0.5$ in most of the cases. For a target bit rate of 64 kbps some video sequences exhibits a weak long range dependence (*Oprah w/o Comm*), some show a strong long range dependence (*Silence of the Lambs*), others show no long range dependence (*LectureHQ-Reisslein*).

Table 4 gives the Hurst parameter estimated using the variance time plot as well as the scaling parameters $\underline{c}_f$ and α (also expressed as $H = (1+\alpha)/2$) estimated from the logscale diagram. Figures 7, 8, and 9 give the variance-time plots, the pox plots of R/S (for $a = 12$), and the periodogram (for $a = 12$). It is observed that the H estimates from the variance time plots are very close to the H estimates given by the R/S plots at the aggregation level of $a = 192$ for encodings without rate control. Hurst parameter estimate from the periodogram technique tends to give a higher H value than the corresponding H obtained using the R/S estimate or the variance time analysis. This is because of the linear fit used to estimate H, which heavily depends on the region from where the samples are chosen. This is unlike the R/S or the variance time test where there are relatively very few samples available for the linear fit. For encodings with rate control, we find that H values estimated from the R/S plots, are quite different from that of variance time plots where both indicate that there is hardly any long range dependence.

Some logscale diagrams are given in Figure 10. We observe that the logscale diagrams give, in many cases, H estimates very close to one or above one, which should be viewed with caution. The H estimates around and above one appear to be due to the fact that the employed logscale estimation assumes Gaussian time series, whereas our trace data is typically non-Gaussian.

The logscale diagrams in Figure 10 typically exhibit a "knee" around scale $j = 4$ or $j = 5$. This time scale, which corresponds to roughly 16 to 32 frames (i.e., about half a second to one second of video) may be a transition point from short-term to long-term scaling. For the longer scales, the logscale plots indicate a reasonable level of scaling, with some "bumps" for very large scales. We find the same logscale behavior in the single layer encoding statistics given in table 4 of Part2 of the technical report series.

We observe that the normalized form $\underline{c}_f$ tends to be very large for video encodings with logscale $H < 0$. We further observe that as the quality of the encoding decreases, the $\underline{c}_f$ estimation either tends to decrease (*Silence of the Lambs*) or remains nearly unchanged (*LectureHQ-Reisslein*).

Table 4: Hurst parameters estimated from variance time plot, scaling parameters estimated from logscale diagram for base layer traffic.

Enc. M.	Video	VT H	Logscale Diagram $\underline{c}_f$	α	H
CIF	*Silence of the Lambs*	0.911	0.023	1.011	1.005
H.Q.	*Terminator One*	0.791	0.036	1.005	1.003
No.R.C.	*Snowboard with Comm*	0.455	0.199	0.8	0.900
	Oprah w/o Comm	0.868	0.001	1.488	1.244
	LectureHQ-Reisslein	0.83	0.005	1.053	1.026
	ParkingLot	0.535	101181.964	-1.482	-0.241
CIF	*Silence of the Lambs*	0.899	0	1.891	1.446
040608.Q.	*Terminator One*	0.780	0.014	0.987	0.994
No.R.C.	*Snowboard with Comm*	0.447	0.053	0.835	0.918
	Oprah w/o Comm	0.828	0.003	1.032	1.016
	LectureHQ-Reisslein	0.832	0.003	0.889	0.944
	ParkingLot	0.473	39175.261	-1.525	-0.262
CIF	*Silence of the Lambs*	0.892	0	1.840	1.420
060810.Q.	*Terminator One*	0.772	0.016	0.976	0.988
No.R.C.	*Snowboard with Comm*	0.445	0.054	0.852	0.926
	Oprah w/o Comm	0.788	0.004	1.027	1.013
	LectureHQ-Reisslein	0.833	0.003	0.884	0.942
	ParkingLot	0.438	53227.020	-1.582	-0.291
CIF	*Silence of the Lambs*	0.889	0	1.772	1.386
H.M.Q.	*Terminator One*	0.771	0.03	0.971	0.986
No.R.C.	*Snowboard with Comm*	0.437	0.096	0.856	0.928
	Oprah w/o Comm	0.754	0.012	1.011	1.005
	LectureHQ-Reisslein	0.822	0.005	0.899	0.949
	ParkingLot	0.443	70820.273	-1.562	-0.281

Table 4: *continued*

		VT	Logscale Diagram		
Enc. M.	Video	H	$\underline{c}_f$	α	H
CIF	*Silence of the Lambs*	0.881	0	1.698	1.349
M.Q.	*Terminator One*	0.756	0.015	0.944	0.972
No.R.C.	*Snowboard with Comm*	0.423	0.036	0.868	0.934
	Oprah w/o Comm	0.716	0.002	1.034	1.017
	LectureHQ-Reisslein	0.837	0.001	0.969	0.985
	ParkingLot	0.408	49346.157	-1.659	-0.329
CIf	*Silence of the Lambs*	0.86	0.002	1.4	1.200
M.L.Q.	*Terminator One*	0.724	0.032	0.896	0.948
No.R.C.	*Snowboard with Comm*	0.425	0.048	0.873	0.936
	Oprah w/o Comm	0.669	0.004	1.102	1.051
	LectureHQ-Reisslein	0.719	0.003	0.922	0.961
	ParkingLot	0.382	5173.761	-1.413	-0.206
CIF	*Silence of the Lambs*	0.845	0.003	1.34	1.170
L.Q.	*Terminator One*	0.704	0.036	0.877	0.938
No.R.C.	*Snowboard with Comm*	0.45	0.045	0.867	0.933
	Oprah w/o Comm	0.602	0.004	1.105	1.053
	LectureHQ-Reisslein	0.664	0.003	0.886	0.943
	ParkingLot	0.35	30439.724	-1.698	-0.349
CIF	*Silence of the Lambs*	0.791	0.007	0.98	0.990
64 kbps	*Terminator One*	0.703	0.036	0.879	0.939
R.C.	*Snowboard with Comm*	0.46	0.045	0.862	0.931
	Oprah w/o Comm	0.522	0.008	1	1.000
	LectureHQ-Reisslein	0.363	1058.407	-1.465	-0.233
	ParkingLot	0.334	47506.306	-1.763	-0.382
CIF	*Silence of the Lambs*	-0.911	1.00675E+18	-5.965	-2.482
128 kbps	*Terminator One*	0.019	95575.049	-2.135	-0.567
R.C.	*Snowboard with Comm*	-1.007	0.182	0.328	0.664
	Oprah w/o Comm	-0.387	2855.483	-1.997	-0.499
	LectureHQ-Reisslein	0.267	0.053	-0.877	0.061
	ParkingLot	-0.246	33093.125	-1.685	-0.343
CIF	*Silence of the Lambs*	0.244	549.708	-1.93	-0.465
256 kbps	*Terminator One*	0.023	0.066	-0.846	0.077
R.C.	*Snowboard with Comm*	0.246	18.341	-1.476	-0.238
	Oprah w/o Comm	0.238	0.029	-0.771	0.114
	LectureHQ-Reisslein	0.161	0.5	-1.112	-0.056
	ParkingLot	-0.12	17.744	-1.585	-0.292

Table 5 gives the scaling parameters α_q for the orders $q = 0.5$, 1, 1.5, 2, 2.5, 3, 3.5, and 4. Figures 11 and 12 give the multiscale diagrams and the linear multiscale diagrams. It can be observed that the scaling parameters increase with increasing q with the exception of the scaling parameters which are negative (in such a case, the scaling parameter decreases as q increases, see *ParkingLot*). With the decrease in the quality of encoding of a given video sequence, the scaling parameter tends to be oscillatory. The Hurst parameter estimate is given by $H = \alpha_2/2$. We observe from Table 5 that in some cases the H estimate is larger than 1, this is because multiscale estimation assumes a Gaussian time series, whereas the traces are typically non-Gaussian. In summary from the R/S, periodogram, variance test, logscale and multiscale Hurst parameter estimates we can conclude that for video encodings without rate control the *ParkingLot* sequence does not exhibit any long range dependence and *Silence of the Lambs* exhibits the strongest long range dependence. For rate control encodings with 128 kbps and 256 kbps, none exhibits long range dependence, whereas some videos at 64 kbps do exhibit weak long range dependence. This is because rate control at 64 kbps is not effective in some cases and can be visualized as a low quality encoding.

Table 5: Scaling parameters estimated from multiscale diagram for base layer traffic.

		Multiscale Diagram, α_q for							
Enc. M.	Video	$q = 0.5$	$q = 1$	$q = 1.5$	$q = 2$	$q = 2.5$	$q = 3$	$q = 3.5$	$q = 4$
CIF	*Silence of the Lambs*	0.506	0.992	1.482	1.979	2.468	2.939	3.391	3.829
H.Q.	*Terminator One*	0.514	1.009	1.488	1.949	2.394	2.823	3.235	3.632
No.R.C.	*Snowboard with Comm*	0.475	0.924	1.356	1.776	2.186	2.589	2.987	3.376
	Oprah w/o Comm	0.629	1.255	1.875	2.504	3.133	3.752	4.359	4.955
	LectureHQ-Reisslein	0.499	1.017	1.551	2.093	2.646	3.216	3.771	4.323
	ParkingLot	-0.257	-0.491	-0.703	-0.895	-1.070	-1.234	-1.394	-1.555
CIF	*Silence of the Lambs*	0.949	1.704	2.377	3.006	3.610	4.198	4.778	5.352
040608.Q.	*Terminator One*	0.501	0.990	1.469	1.925	2.361	2.781	3.184	3.571
No.R.C.	*Snowboard with Comm*	0.480	0.938	1.379	1.810	2.234	2.654	3.069	3.481
	Oprah w/o Comm	0.530	1.054	1.558	2.030	2.462	2.853	3.211	3.546
	LectureHQ-Reisslein	0.480	0.931	1.371	1.813	2.258	2.701	3.135	3.559
	ParkingLot	-0.263	-0.531	-0.782	-1.012	-1.227	-1.434	-1.639	-1.847
CIF	*Silence of the Lambs*	0.910	1.660	2.345	2.989	3.606	4.205	4.794	5.376
060810.Q.	*Terminator One*	0.495	0.980	1.458	1.910	2.345	2.762	3.165	3.551
No.R.C.	*Snowboard with Comm*	0.484	0.943	1.388	1.825	2.257	2.685	3.111	3.534
	Oprah w/o Comm	0.534	1.053	1.552	2.019	2.446	2.832	3.185	3.515
	LectureHQ-Reisslein	0.482	0.934	1.373	1.814	2.259	2.699	3.128	3.544
	ParkingLot	-0.287	-0.581	-0.859	-1.114	-1.354	-1.586	-1.817	-2.051
CIF	*Silence of the Lambs*	0.874	1.610	2.290	2.931	3.546	4.144	4.730	5.309
H.M.Q.	*Terminator One*	0.491	0.974	1.446	1.902	2.334	2.751	3.154	3.542
No.R.C.	*Snowboard with Comm*	0.485	0.945	1.392	1.831	2.265	2.696	3.124	3.550
	Oprah w/o Comm	0.530	1.046	1.541	2.005	2.429	2.813	3.164	3.490
	LectureHQ-Reisslein	0.486	0.942	1.387	1.834	2.284	2.729	3.160	3.577
	ParkingLot	-0.296	-0.581	-0.845	-1.089	-1.317	-1.537	-1.756	-1.978
CIF	*Silence of the Lambs*	0.795	1.543	2.264	2.952	3.612	4.253	4.879	5.494
M.Q.	*Terminator One*	0.490	0.960	1.415	1.865	2.286	2.691	3.081	3.457
No.R.C.	*Snowboard with Comm*	0.482	0.945	1.395	1.840	2.280	2.719	3.155	3.588
	Oprah w/o Comm	0.549	1.078	1.580	2.039	2.447	2.810	3.140	3.450
	LectureHQ-Reisslein	0.471	0.953	1.442	1.933	2.422	2.908	3.390	3.854
	ParkingLot	-0.338	-0.664	-0.966	-1.241	-1.497	-1.740	-1.979	-2.219
CIF	*Silence of the Lambs*	0.558	1.154	1.773	2.406	3.045	3.675	4.288	4.884
M.L.Q.	*Terminator One*	0.474	0.924	1.361	1.797	2.203	2.597	2.980	3.351

Table 5: *continued*

Enc. M.	Video	Multiscale Diagram, α_q for $q = 0.5$	$q = 1$	$q = 1.5$	$q = 2$	$q = 2.5$	$q = 3$	$q = 3.5$	$q = 4$
No.R.C.	*Snowboard with Comm*	0.475	0.938	1.393	1.844	2.292	2.736	3.175	3.607
	Oprah w/o Comm	0.551	1.109	1.666	2.206	2.718	3.201	3.661	4.103
	LectureHQ-Reisslein	0.504	0.975	1.439	1.910	2.389	2.844	3.282	3.696
	ParkingLot	-0.175	-0.317	-0.439	-0.552	-0.664	-0.780	-0.901	-1.029
CIF	*Silence of the Lambs*	0.551	1.136	1.737	2.345	2.956	3.565	4.159	4.736
L.Q.	*Terminator One*	0.470	0.915	1.347	1.777	2.178	2.567	2.946	3.312
No.R.C.	*Snowboard with Comm*	0.466	0.924	1.379	1.829	2.275	2.716	3.150	3.576
	Oprah w/o Comm	0.523	1.050	1.586	2.123	2.653	3.175	3.688	4.187
	LectureHQ-Reisslein	0.488	0.955	1.409	1.862	2.297	2.700	3.091	3.457
	ParkingLot	-0.238	-0.465	-0.666	-0.844	-1.009	-1.168	-1.324	-1.483
CIF	*Silence of the Lambs*	0.464	1.038	1.601	2.121	2.590	3.038	3.469	3.922
64 kbps	*Terminator One*	0.470	0.916	1.347	1.774	2.173	2.559	2.935	3.300
R.C.	*Snowboard with Comm*	0.463	0.919	1.375	1.829	2.280	2.729	3.172	3.610
	Oprah w/o Comm	0.511	1.027	1.529	2.011	2.468	2.901	3.314	3.710
	LectureHQ-Reisslein	0.105	0.038	-0.273	-0.677	-1.106	-1.541	-1.977	-2.412
	ParkingLot	-0.243	-0.486	-0.711	-0.915	-1.104	-1.283	-1.457	-1.633
CIF	*Silence of the Lambs*	-0.216	-1.705	-3.567	-5.393	-7.183	-8.951	-10.702	-12.443
128 kbps	*Terminator One*	-0.003	-0.281	-0.727	-1.232	-1.751	-2.273	-2.796	-3.322
R.C.	*Snowboard with Comm*	0.304	0.639	0.976	1.305	1.626	1.942	2.250	2.554
	Oprah w/o Comm	0.023	-0.111	-0.463	-0.921	-1.410	-1.908	-2.411	-2.917
	LectureHQ-Reisslein	0.000	0.030	0.073	0.112	0.135	0.135	0.113	0.071
	ParkingLot	-0.204	-0.398	-0.585	-0.773	-0.966	-1.165	-1.372	-1.584
CIF	*Silence of the Lambs*	0.085	0.008	-0.344	-0.919	-1.573	-2.235	-2.889	-3.534
256 kbps	*Terminator One*	0.059	0.102	0.136	0.164	0.183	0.194	0.198	0.194
R.C.	*Snowboard with Comm*	-0.087	-0.177	-0.267	-0.357	-0.451	-0.550	-0.645	-0.758
	Oprah w/o Comm	0.053	0.087	0.140	0.213	0.300	0.392	0.481	0.563
	LectureHQ-Reisslein	-0.028	-0.048	-0.066	-0.089	-0.124	-0.180	-0.259	-0.361
	ParkingLot	-0.206	-0.369	-0.517	-0.679	-0.875	-1.119	-1.409	-1.735

2.2 Enhancement Layer Traffic

Table 6 gives the mean frame size $\bar{X}^e$, the coefficient of variation CoV_X^e, and the peak-to-mean ratio $X^e_{\max}/\bar{X}^e$ of the enhancement layer frame sizes along with the mean bit rate $\bar{X}^e/T$ and the peak bit rate $X^e_{\max}/T$.

Focusing for now on the encodings without rate control, as the quantization parameter increases (quality of encoding decreases) we find that the enhancement layer mean frame size decreases, except for the H.M.Q quality encoding where all video encodings (with the exception of *Snowboard with Commercials*) give a larger mean frame size than the 060810.Q encodings. Further investigation of this effect is needed. We further observe that the average enhancement layer frame sizes are 2 to 3 times larger than the corresponding average base layer frame sizes for videos encoded without rate control. Since the enhancement layer increases the format of the decoded frame by a factor of four, we would expect that the enhancement layer is an average of roughly three times larger than the base layer. However there is no consistent behavior in this ratio as the quality of the encoding changes for a given video.

We also observe that for most of the encodings, the enhancement layer traffic is smoother (CoV_X^e is small for smooth traffic) than the base layer traffic with exception of a few. This effect is especially significant for the medium and low quality encodings. It is also observed that the CoV_X^e varies over a narrower range as compared to the variation of the CoV_X^b for different encodings. The peak to mean ratio $(\bar{X}^e/\bar{X}^b)$ is 1 to 1.5 times larger than the corresponding $X^b_{\max}/\bar{X}^b$. The CoV_X^e and $\bar{X}^e/\bar{X}^b$ generally increase a little bit as the quality of the encoding decreases indicating the fact that low quality encoded video traffic tends to be more bursty. The combined effect of the reduced variability and increased average of the enhancement layer traffic on providers of scalable video services over networks will be studied in detail in future work.

We next turn to the enhancement layer frame size statistics for the encodings with rate control. Recall from Part 1 that the rate control is applied only to the base layer. The enhancement layer is encoded with the fixed quantization parameters 10 for I frames, 14 for P frames, and 16 for B frames, which we refer to as the medium quality level. Indeed, the frame size statistics of the enhancement layer of the rate controlled encodings are roughly equal to the corresponding statistics of the medium quality encodings without rate control. It is also interesting to note that these enhancement layers, which are encoded without rate control are significantly smoother than the base layers, which are encoded with rate control (albeit with a scheme that strives to provide rate control at the GoP time scale).

We remind here again that the enhancement layer is not rate controlled, rate control is applied only for base layer. This is the reason why we do not see a constant frame size in enhancement layer for rate controlled encodings. For a given encoding mode, *Silence of the Lambs* has the smallest mean frame size in the enhancement layer and *ParkingLot* has the largest mean frame size. For encodings ranging from the high quality to the H.M quality, we observe that the mean frame size of *Oprah w/o Commercials* is larger than for *Terminator I*, but from the medium quality onwards this reverses. When compared to the corresponding base layer mean frame size, *Silence of the lambs* has the smallest mean frame size, *ParkingLot* has the largest frame size in encodings without rate control and 64 kbps target bit rate control encoding.

We observe that the mean frame size in the enhancement layer varies slightly. This indicates that the amount of traffic generated in the enhancement layer is effected by the base layer encoding type and quality. This is because the larger the target bit rate at the base layer, the more information the video captures in the base layer, leaving less information for the enhancement layer.

Table 6: Overview of frame statistics of the enhancement layer of spatial scalable encoded video

		Frame Size			Bit Rate	
		Mean	CoV	Peak/Mean	Mean	Peak
Enc. M.	Video	$\bar{X}^e$ [kbyte]	CoV_X^e	$X_{\max}^e/\bar{X}^e$	$\bar{X}^e/T$ [Mbps]	$X_{\max}^e/T$ [Mbps]
CIF	*Silence of the Lambs*	5.765	0.757	8.654	1.384	11.974
H.Q.	*Terminator One*	8.560	0.607	6.189	2.054	12.716
No.R.C.	*Snowboard with Comm*	13.831	0.391	4.351	3.319	14.442
	Oprah w/o Comm	16.564	0.255	2.635	3.975	10.475
	LectureHQ-Reisslein	6.307	0.395	6.704	1.514	10.147
	ParkingLot	17.793	0.378	3.928	4.270	16.773
CIF	*Silence of the Lambs*	1.843	1.262	19.209	0.442	8.498
040608.Q.	*Terminator One*	3.465	0.885	10.461	0.831	8.698
No.R.C.	*Snowboard with Comm*	5.048	0.644	7.185	1.211	8.705
	Oprah w/o Comm	5.256	0.410	4.998	1.261	6.304
	LectureHQ-Reisslein	2.050	0.912	13.929	0.492	6.852
	ParkingLot	7.362	0.658	6.907	1.767	12.204
CIF	*Silence of the Lambs*	1.337	1.343	20.609	0.321	6.611
060810.Q.	*Terminator One*	2.625	0.943	12.017	0.630	7.570
No.R.C.	*Snowboard with Comm*	3.581	0.701	8.278	0.859	7.114
	Oprah w/o Comm	3.426	0.438	6.581	0.822	5.412
	LectureHQ-Reisslein	1.154	1.125	21.162	0.277	5.861
	ParkingLot	4.324	0.860	9.466	1.038	9.824
CIF	*Silence of the Lambs*	1.386	1.247	16.844	0.333	5.601
H.M.Q.	*Terminator One*	2.661	0.895	11.862	0.639	7.576
No.R.C.	*Snowboard with Comm*	3.544	0.658	8.423	0.851	7.165
	Oprah w/o Comm	3.440	0.402	6.553	0.826	5.410
	LectureHQ-Reisslein	1.472	0.728	16.661	0.353	5.885
	ParkingLot	5.280	0.639	6.492	1.267	8.227
CIF	*Silence of the Lambs*	0.720	1.423	25.621	0.173	4.429
M.Q.	*Terminator One*	1.494	1.053	16.105	0.359	5.775
No.R.C.	*Snowboard with Comm*	1.797	0.797	11.815	0.431	5.094
	Oprah w/o Comm	1.478	0.518	12.089	0.355	4.288
	LectureHQ-Reisslein	0.693	0.940	25.367	0.166	4.218
	ParkingLot	2.698	0.793	9.354	0.647	6.056
CIF	*Silence of the Lambs*	0.514	1.218	28.571	0.123	3.528
M.L.Q.	*Terminator One*	1.016	1.039	18.614	0.244	4.539
No.R.C.	*Snowboard with Comm*	1.102	0.788	14.739	0.264	3.897
	Oprah w/o Comm	0.859	0.540	16.873	0.206	3.479

Table 6: *continued*

	LectureHQ-Reisslein	0.464	0.780	29.009	0.111	3.233
	ParkingLot	1.559	0.772	9.770	0.374	3.655
CIF	*Silence of the Lambs*	0.436	1.103	30.074	0.105	3.147
L.Q.	*Terminator One*	0.826	1.034	19.712	0.198	3.910
No.R.C.	*Snowboard with Comm*	0.859	0.773	16.443	0.206	3.389
	Oprah w/o Comm	0.641	0.564	19.342	0.154	2.976
	LectureHQ-Reisslein	0.373	0.728	31.906	0.090	2.859
	ParkingLot	1.152	0.768	11.456	0.276	3.167
CIF	*Silence of the Lambs*	0.836	1.369	22.070	0.201	4.428
64 kbps	*Terminator One*	1.757	0.946	13.711	0.422	5.782
R.C.	*Snowboard with Comm*	2.047	0.822	10.700	0.491	5.257
	Oprah w/o Comm	1.827	0.584	9.848	0.439	4.320
	LectureHQ-Reisslein	0.776	1.184	22.801	0.186	4.245
	ParkingLot	2.981	0.864	8.661	0.716	6.197
CIF	*Silence of the Lambs*	0.732	1.506	25.145	0.176	4.420
128 kbps	*Terminator One*	1.622	1.016	14.873	0.389	5.789
R.C.	*Snowboard with Comm*	1.988	0.831	11.018	0.477	5.257
	Oprah w/o Comm	1.635	0.553	10.883	0.392	4.270
	LectureHQ-Reisslein	0.704	0.992	25.010	0.169	4.226
	ParkingLot	2.965	0.859	8.678	0.712	6.175
CIF	*Silence of the Lambs*	0.676	1.556	27.201	0.162	4.415
256 kbps	*Terminator One*	1.432	1.128	16.760	0.344	5.760
R.C.	*Snowboard with Comm*	1.828	0.835	11.862	0.439	5.203
	Oprah w/o Comm	1.433	0.569	12.511	0.344	4.302
	LectureHQ-Reisslein	0.689	0.894	25.422	0.165	4.204
	ParkingLot	2.797	0.815	9.142	0.671	6.137

Table 7 gives the mean GoP sizes ($\bar{Y}^e$), the coefficients of variation of the GoP sizes (CoV_Y^e), and the peak-to-mean ratio ($Y^e_{\max}/\bar{Y}^e$) of the GoP sizes, as well as the peak bit rate ($Y^b_{\max}/(GT)$).

We observe that the CoV_Y^e and $Y^e_{\max}/\bar{Y}^e$ of video sequences encoded without rate control have slightly higher values (around 10 to 30 percent) when compared with the corresponding values for base layer traffic given in Table 2, in some encodings they are nearly equal. As the quality of the encoding decreases, the CoV_Y^e and $Y^e_{\max}/\bar{Y}^e$ values generally increases indicating that low quality video is bursty in nature. For rate controlled encodings, we find that the CoV_Y^e and $Y^e_{\max}/\bar{Y}^e$ are almost equal for target bit rates of 64, 128, and 256 kbps and are little bit higher when compared with the corresponding CoV_Y^b and $Y^b_{\max}/\bar{Y}^b$. This is because the enhancement layer traffic is not rate controlled (rate control is applied only for base layer) and the fact that MPEG trys to maintain a constant quality at variable traffic. The GoP statistics for encodings with the target bit rates 64, 128, and 256 kbps have similar values with very slight changes because we encoded the enhancement layer with Medium Quality (I=10, P=14, B=16). Slight changes in values are because the type of encoding in base layer effects enhancement layer traffic.

As per general expectation the mean GoP size ($\bar{Y}^e$) in the enhancement layer is quite large (roughly 3 times) when compared to the base layer mean GoP frame size ($\bar{Y}^b$) because the enhancement layer is encoded in the CIF format (where the CIF frame format is 4 times larger than the QCIF frame format).

Table 7: Overview of GoP statistics of the enhancement layer of spatial scalable encoded video

		GoP Size			Peak
		Mean	CoV	Peak/Mean	Bit Rate
Enc. M.	Video	$\bar{Y}^e$ [kbyte]	CoV_Y^e	$Y^e_{\max}/\bar{Y}^e$	$Y^e_{\max}/(GT)$ [Mbps]
CIF	*Silence of the Lambs*	69.182	0.658	6.182	8.554
H.Q.	*Terminator One*	102.724	0.427	2.844	5.843
No.R.C.	*Snowboard with Comm*	165.970	0.361	2.889	9.590
	Oprah w/o Comm	198.773	0.245	1.886	7.497
	LectureHQ-Reisslein	75.681	0.235	2.894	4.381
	ParkingLot	213.511	0.328	2.965	12.663
CIF	*Silence of the Lambs*	22.119	1.004	10.269	4.543
040608.Q.	*Terminator One*	41.575	0.533	3.398	2.826
No.R.C.	*Snowboard with Comm*	60.572	0.529	4.310	5.221
	Oprah w/o Comm	63.072	0.334	2.571	3.243
	LectureHQ-Reisslein	24.597	0.315	3.886	1.912
	ParkingLot	88.344	0.493	4.094	7.234
CIF	*Silence of the Lambs*	16.040	1.054	11.189	3.589
060810.Q.	*Terminator One*	31.499	0.555	3.432	2.162
No.R.C.	*Snowboard with Comm*	42.971	0.581	4.872	4.187
	Oprah w/o Comm	41.116	0.364	2.844	2.339
	LectureHQ-Reisslein	13.847	0.548	5.126	1.420
	ParkingLot	51.892	0.712	5.664	5.878
CIF	*Silence of the Lambs*	16.626	1.001	10.585	3.520
H.M.Q.	*Terminator One*	31.936	0.542	3.330	2.127
No.R.C.	*Snowboard with Comm*	42.532	0.576	4.842	4.119
	Oprah w/o Comm	41.279	0.353	2.788	2.302

Table 7: *continued*

	LectureHQ-Reisslein	17.662	0.319	4.005	1.415
	ParkingLot	63.358	0.542	4.543	5.757
CIF	*Silence of the Lambs*	8.643	1.085	12.425	2.148
M.Q.	*Terminator One*	17.930	0.598	3.647	1.308
No.R.C.	*Snowboard with Comm*	21.560	0.667	5.977	2.577
	Oprah w/o Comm	17.735	0.418	3.865	1.371
	LectureHQ-Reisslein	8.315	0.358	4.411	0.734
	ParkingLot	32.373	0.649	5.720	3.704
CIF	*Silence of the Lambs*	6.173	0.916	10.941	1.351
M.L.Q.	*Terminator One*	12.192	0.586	3.951	0.963
No.R.C.	*Snowboard with Comm*	13.220	0.653	6.182	1.635
	Oprah w/o Comm	10.308	0.386	4.227	0.871
	LectureHQ-Reisslein	5.572	0.300	4.061	0.453
	ParkingLot	18.706	0.649	6.386	2.389
CIF	*Silence of the Lambs*	5.231	0.819	9.969	1.043
L.Q.	*Terminator One*	9.918	0.577	4.264	0.846
No.R.C.	*Snowboard with Comm*	10.306	0.633	6.187	1.275
	Oprah w/o Comm	7.693	0.378	4.408	0.678
	LectureHQ-Reisslein	4.480	0.273	3.958	0.355
	ParkingLot	13.823	0.644	6.762	1.869
CIF	*Silence of the Lambs*	10.030	1.068	12.221	2.452
64 kbps	*Terminator One*	21.084	0.570	3.648	1.538
R.C.	*Snowboard with Comm*	24.567	0.620	5.451	2.678
	Oprah w/o Comm	21.930	0.369	3.271	1.435
	LectureHQ-Reisslein	9.309	0.374	4.350	0.810
	ParkingLot	35.776	0.613	5.383	3.852
CIF	*Silence of the Lambs*	8.788	1.201	13.949	2.452
128 kbps	*Terminator One*	19.461	0.637	3.952	1.538
R.C.	*Snowboard with Comm*	23.858	0.653	5.613	2.678
	Oprah w/o Comm	19.617	0.435	3.647	1.431
	LectureHQ-Reisslein	8.448	0.379	4.753	0.803
	ParkingLot	35.579	0.619	5.413	3.851
CIF	*Silence of the Lambs*	8.116	1.197	15.102	2.451
256 kbps	*Terminator One*	17.183	0.658	4.249	1.460
R.C.	*Snowboard with Comm*	21.931	0.694	6.058	2.657
	Oprah w/o Comm	17.191	0.464	3.992	1.373
	LectureHQ-Reisslein	8.268	0.355	4.717	0.780
	ParkingLot	33.565	0.667	5.680	3.813

Figure 13 gives the frame size X_n^e (in byte) as a function of the frame number n. From the plots we observe that *Oprah w/o Commercials* has the least variability, whereas *Snowboard with Commercials* and *Silence of the Lambs* both have higher variability (black regions in the plot indicate high density of samples and the wider the black region is, the wider the samples are distributed). Comparing Figure 13 and Figure 1 (*Oprah w/o Commercials*), we clearly notice the increase in the peak-to-mean ratio in the enhancement layer traffic as the mean of the plots remains almost constant, however the peaks are higher in the enhancement layer traffic. Similar behavior is observed for *Snowboard with Commercials.* Plots b and e of Figure 13 look similar, as the 128 kbps target bit rate has enhancement layer set to the medium quality level. The other two plots (d and f) should look similar to the corresponding medium quality encodings.

Figure 14 gives the GoP size Y_m^e (in bytes) as a function of the GoP number m. For encodings without rate control these plots look similar to corresponding GoP plots for the base layer traffic. This is corroborated by the fact that the coefficients of variation for the base layer and the enhancement layer (GoP level) have nearly the same values and peak-to-mean ratios are close as reported in Table 2 and 7. As the enhancement layer is encoded in Medium quality, we observe that the plots d,e, and f (which are encoded at the target bit rates 64, 128, and 256 kbps) are similar to the GoP level enhancement layer traffic plot for videos encoded without rate control at Medium quality.

The observations and conclusions made from Figure 13 and Figure 14 are further strengthened by Figure 15 which gives the histograms of the frame sizes X_n^e. The wider the histogram, the higher is variance of the traffic. Similar to earlier observations, the encodings with rate control have almost the same histograms as one would obtain from the corresponding enhancement layer of Medium quality encoded videos.

Figure 16 gives the autocorrelation coefficient $\rho_X^e(k)$ of the frame size sequence X_n^e, $n = 0, \ldots, N-1$, as a function of the lag k (in frames). We observe that the autocorrelation function, is a series of spikes superimposed on a decreasing slope curve. High magnitude spikes are due to relatively large sizes of P frames in a GoP as compared to B frames. The frequency of these large magnitude spikes is a 12 frame lag, corresponding to the P frame frequency in the enhancement layer. However, in this plots we do not observe intermediate spikes as was observed in single layer autocorrelation function plots. In addition, we find that the relative difference between the maximum and minimum value of the spikes is smaller than what is found in the corresponding single layer autocorrelation function. This is because of the GoP structure difference (single layer has I frames which are far larger than P and B frames, thus we find a large spike followed by a few smaller spikes due to P-P and B-B correlation). We further notice that unlike the previous autocorrelation plots observed for base layer and single layer traffic, the autocorrelation plots in the enhancement layer tend to be smooth in between spikes (for Medium and Low quality). This is because there are only P and B frames in the enhancement layer and inside a GoP, many a times B frames can be of almost same sizes. This leads to near exponential decay in between spikes (because autocorrelation of step function and another step function is a exponential decay).

We further notice that for rate controlled sequences, the autocorrelation plot is similar to the ones for Medium quality encodings without rate control. Figure 17 gives the autocorrelation coefficient $\rho_{Y^e}(k)$ of the GoP size sequence $Y^e_m,\ m = 0, \ldots, N/G-1$, as a function of the lag k (in GoPs). We find near exponential decay for *Snowboard with Comm* and *Oprah w/o Comm*, the former taking 40 GoP duration and the latter taking 80 GoP duration to drop to zero. This might indicate a weak long range dependence. We also observe that for videos encoded without rate control, the GoP size autocorrelation for enhancement layer is similar to the one obtained for base layer traffic except for a level shift in the enhancement layer and we found the same difference for encodings with rate control.

Table 8 gives the Hurst parameter obtained with the R/S heuristics and the periodogram for $X^e_n,\ n = 0, \ldots, N-1$, as a function of the aggregation level a and Figure 19, and Figure 20 gives the corresponding plots. It is found that the Hurst parameter estimates from the R/S plot and the periodogram for the enhancement layer traffic are almost the same as the one obtained for base layer traffic considering encodings of similar quality (without rate control) with the exception of only one video, namely the *ParkingLot* at 060810 quality encoding. This again indicates that the long range dependence property of a video sequence does not change with scaling. For CIF spatial encodings, we choose the base layer to be in the QCIF format (which is a scaled down version of CIF sequence) whereas the enhancement layer in the CIF format. This is because scaling changes the encoded frame size, but it does not effect the successive frame size relation (relative) which means that autocorrelation function slope is relatively unchanged, thus not effecting the long range dependence estimation (compare Figure 17 for enhancement layer GoP level autocorrelation function and Figure 6 for base layer GoP level autocorrelation function).

The observations made for Hurst parameter estimation given in Table 3 for encodings without rate control are also valid for Table 8, as the H estimation in the enhancement layer is nearly equal to that of the base layer traffic.

For encodings with rate control, as the enhancement layer is encoded with Medium quality (rate control is applied for only base layer) we observe that the H estimate differs from that of Table 3. These new value of H estimation is equal to that obtained for Medium quality encodings of enhancement layer and all three encoding types 64, 128, 256 kbps show little variation in the H estimates (this little change is because rate control is applied to the base layer) but they do not effect the final decision about the long range dependence from the H parameter.

Table 8: Hurst parameters estimated from pox diagram of R/S and periodogram as a function of the aggregation level a for enhancement layer traffic.

		Aggregation level a [frames]										
Enc. M.	Video	12	24	48	96	192	300	396	504	600	696	792
CIF	*Silence of the Lambs*	0.921	0.906	0.911	0.929	0.971	0.935	0.942	0.828	0.859	0.897	0.814
H.Q.	*Silence of the Lambs*	1.168	1.245	1.176	1.049	1.066	1.117	1.020	1.138	1.034	1.063	1.148
No.R.C.	*Terminator One*	0.833	0.826	0.826	0.826	0.838	0.881	0.908	0.919	0.937	0.973	0.959
	Terminator One	1.115	1.098	1.023	0.930	0.933	0.855	0.841	0.802	0.721	0.923	0.785
	Snowboard with Comm	0.719	0.686	0.638	0.583	0.537	0.569	0.478	0.554	0.513	0.427	0.453
	Snowboard with Comm	1.193	1.086	0.820	0.804	0.746	0.704	0.531	0.581	0.632	0.504	0.475
	Oprah w/o Comm	0.858	0.840	0.834	0.832	0.834	0.895	0.807	0.831	0.929	0.736	0.823
	Oprah w/o Comm	1.280	1.249	1.227	1.121	1.115	1.064	1.163	1.107	1.057	1.079	0.964
	LectureHQ-Reisslein	0.877	0.875	0.852	0.848	0.812	0.798	0.818	0.809	0.772	0.740	0.746
	LectureHQ-Reisslein	1.103	1.097	1.086	1.102	1.014	1.032	1.088	0.960	0.889	0.987	0.827
	ParkingLot	0.494	0.455	0.475	0.484	0.472	0.500	0.548	0.652	0.760	0.674	0.785
	ParkingLot	0.959	0.764	0.628	0.482	0.535	0.375	0.272	0.294	0.404	0.468	0.443
CIF	*Silence of the Lambs*	0.920	0.904	0.913	0.919	0.936	0.894	0.907	0.804	0.827	0.913	0.820
040608.Q.	*Silence of the Lambs*	1.056	1.157	1.137	1.036	1.013	1.099	1.059	1.153	1.021	1.164	1.245
No.R.C.	*Terminator One*	0.819	0.802	0.798	0.793	0.814	0.872	0.892	0.906	0.948	0.995	1.001
	Terminator One	1.070	1.059	0.997	0.901	0.892	0.796	0.810	0.750	0.664	0.841	0.715
	Snowboard with Comm	0.738	0.701	0.660	0.619	0.582	0.600	0.532	0.583	0.478	0.475	0.436
	Snowboard with Comm	1.163	1.075	0.859	0.871	0.814	0.756	0.654	0.698	0.770	0.626	0.668
	Oprah w/o Comm	0.847	0.817	0.797	0.776	0.780	0.839	0.735	0.743	0.852	0.657	0.777
	Oprah w/o Comm	1.191	1.209	1.218	1.086	1.076	1.004	1.071	1.046	0.921	1.124	0.882
	LectureHQ-Reisslein	0.859	0.852	0.837	0.833	0.827	0.843	0.860	0.836	0.849	0.875	0.901
	LectureHQ-Reisslein	1.070	1.043	1.007	1.023	0.943	0.957	0.958	0.895	0.839	0.830	0.768
	ParkingLot	0.441	0.399	0.420	0.457	0.478	0.497	0.571	0.640	0.731	0.662	0.753
	ParkingLot	0.926	0.729	0.565	0.371	0.465	0.275	0.246	0.268	0.249	0.393	0.373
	Silence of the Lambs	0.919	0.906	0.908	0.911	0.924	0.884	0.898	0.792	0.811	0.909	0.816
CIF	*Silence of the Lambs*	1.031	1.124	1.110	1.023	1.001	1.080	1.036	1.129	1.021	1.159	1.180
060810.Q.	*Terminator One*	0.811	0.793	0.788	0.779	0.797	0.861	0.876	0.898	0.937	0.970	0.996
No.R.C.	*Terminator One*	1.054	1.044	0.992	0.892	0.886	0.781	0.807	0.730	0.648	0.804	0.686
	Snowboard with Comm	0.739	0.703	0.666	0.627	0.599	0.602	0.552	0.586	0.462	0.492	0.443
	Snowboard with Comm	1.152	1.069	0.873	0.892	0.827	0.726	0.679	0.755	0.791	0.639	0.664
	Oprah w/o Comm	0.839	0.808	0.787	0.759	0.763	0.812	0.708	0.713	0.820	0.651	0.729
	Oprah w/o Comm	1.158	1.185	1.209	1.074	1.066	0.981	1.032	1.049	0.881	1.097	0.865
	LectureHQ-Reisslein	0.901	0.899	0.895	0.890	0.870	0.921	0.880	0.874	0.947	0.923	0.920
	LectureHQ-Reisslein	1.091	1.092	1.073	1.130	1.143	1.113	1.166	1.216	1.124	1.281	1.186
	ParkingLot	0.566	0.556	0.620	0.715	0.747	0.858	0.860	0.888	0.995	0.870	0.956
	ParkingLot	1.077	0.965	0.906	0.788	0.954	0.917	1.042	1.117	1.154	1.204	1.233
CIF	*Silence of the Lambs*	0.919	0.907	0.910	0.912	0.927	0.889	0.899	0.795	0.820	0.909	0.815
H.M.Q.	*Silence of the Lambs*	1.038	1.135	1.117	1.026	1.001	1.080	1.034	1.116	1.017	1.149	1.191
No.R.C.	*Terminator One*	0.811	0.793	0.788	0.777	0.797	0.860	0.876	0.897	0.936	0.970	0.998
	Terminator One	1.056	1.042	0.997	0.895	0.888	0.777	0.804	0.728	0.645	0.810	0.684
	Snowboard with Comm	0.734	0.698	0.660	0.621	0.592	0.602	0.547	0.585	0.466	0.485	0.440
	Snowboard with Comm	1.138	1.061	0.861	0.880	0.817	0.714	0.661	0.714	0.762	0.622	0.660
	Oprah w/o Comm	0.840	0.809	0.788	0.762	0.766	0.809	0.704	0.710	0.817	0.654	0.723
	Oprah w/o Comm	1.154	1.191	1.205	1.071	1.051	0.968	1.019	1.038	0.874	1.099	0.857
	LectureHQ-Reisslein	0.851	0.840	0.825	0.825	0.823	0.842	0.846	0.844	0.855	0.908	0.924
	LectureHQ-Reisslein	1.052	1.026	0.995	1.004	0.937	0.946	0.952	0.908	0.830	0.832	0.796
	ParkingLot	0.423	0.380	0.397	0.442	0.477	0.493	0.571	0.623	0.714	0.632	0.747
	ParkingLot	0.915	0.716	0.538	0.337	0.442	0.238	0.238	0.278	0.225	0.364	0.359
CIF	*Silence of the Lambs*	0.912	0.904	0.905	0.898	0.896	0.853	0.872	0.761	0.780	0.888	0.807
M.Q.	*Silence of the Lambs*	0.992	1.079	1.068	1.023	0.988	1.064	1.035	1.041	1.019	1.120	1.119
No.R.C.	*Terminator One*	0.792	0.778	0.770	0.761	0.768	0.832	0.836	0.869	0.903	0.918	0.958
	Terminator One	1.022	1.007	0.969	0.865	0.886	0.736	0.763	0.706	0.592	0.727	0.631
	Snowboard with Comm	0.748	0.710	0.679	0.651	0.623	0.593	0.594	0.581	0.460	0.528	0.434
	Snowboard with Comm	1.123	1.059	0.894	0.925	0.839	0.695	0.727	0.688	0.792	0.656	0.604
	Oprah w/o Comm	0.844	0.815	0.783	0.749	0.747	0.768	0.703	0.680	0.792	0.645	0.689
	Oprah w/o Comm	1.067	1.125	1.180	1.074	1.063	0.952	1.022	1.052	0.867	0.977	0.876
	LectureHQ-Reisslein	0.839	0.834	0.820	0.815	0.805	0.844	0.841	0.849	0.875	0.944	0.952
	LectureHQ-Reisslein	1.029	0.989	0.953	0.950	0.875	0.896	0.900	0.897	0.785	0.828	0.724
	ParkingLot	0.395	0.348	0.358	0.414	0.487	0.510	0.579	0.607	0.674	0.616	0.734
	ParkingLot	0.904	0.690	0.503	0.272	0.402	0.220	0.251	0.283	0.225	0.349	0.343
CIF	*Silence of the Lambs*	0.906	0.901	0.899	0.893	0.889	0.833	0.859	0.746	0.769	0.875	0.797
M.L.Q.	*Silence of the Lambs*	0.986	1.074	1.060	1.006	0.984	1.027	0.985	0.965	0.985	1.058	1.087
No.R.C.	*Terminator One*	0.780	0.768	0.761	0.750	0.752	0.816	0.809	0.838	0.880	0.885	0.927
	Terminator One	0.996	0.983	0.951	0.853	0.866	0.725	0.724	0.743	0.589	0.727	0.636
	Snowboard with Comm	0.744	0.706	0.676	0.651	0.630	0.583	0.600	0.568	0.474	0.539	0.416
	Snowboard with Comm	1.098	1.028	0.888	0.922	0.838	0.661	0.718	0.598	0.724	0.636	0.519
	Oprah w/o Comm	0.828	0.819	0.781	0.740	0.738	0.741	0.685	0.668	0.746	0.672	0.704
	Oprah w/o Comm	0.996	1.067	1.129	1.066	1.052	0.925	1.006	1.036	0.863	0.970	0.871
	LectureHQ-Reisslein	0.827	0.814	0.795	0.792	0.780	0.795	0.799	0.819	0.840	0.866	0.892
	LectureHQ-Reisslein	0.996	0.968	0.938	0.930	0.874	0.833	0.915	0.877	0.714	0.799	0.688
	ParkingLot	0.375	0.328	0.335	0.391	0.491	0.526	0.574	0.597	0.654	0.612	0.730

Table 8: *continued*

Enc. M.	Video	Aggregation level a [frames]										
		12	24	48	96	192	300	396	504	600	696	792
	ParkingLot	0.903	0.664	0.468	0.248	0.374	0.209	0.259	0.249	0.210	0.320	0.319
CIF	*Silence of the Lambs*	0.903	0.896	0.893	0.884	0.866	0.822	0.851	0.743	0.762	0.857	0.792
L.Q.	*Silence of the Lambs*	0.978	1.065	1.043	0.998	0.981	0.989	0.957	0.930	0.975	1.040	1.047
No.R.C.	*Terminator One*	0.776	0.765	0.759	0.746	0.754	0.806	0.801	0.825	0.869	0.869	0.921
	Terminator One	0.985	0.971	0.949	0.859	0.866	0.729	0.706	0.801	0.597	0.731	0.653
	Snowboard with Comm	0.749	0.709	0.680	0.654	0.635	0.583	0.610	0.559	0.484	0.571	0.424
	Snowboard with Comm	1.087	1.017	0.887	0.917	0.838	0.646	0.702	0.577	0.685	0.641	0.479
	Oprah w/o Comm	0.817	0.810	0.774	0.741	0.740	0.733	0.681	0.640	0.717	0.618	0.664
	Oprah w/o Comm	0.954	1.026	1.074	1.042	1.077	0.958	0.984	1.036	0.869	0.931	0.888
	LectureHQ-Reisslein	0.815	0.803	0.786	0.776	0.742	0.741	0.749	0.789	0.779	0.749	0.798
	LectureHQ-Reisslein	0.982	0.949	0.935	0.931	0.884	0.846	0.918	0.889	0.769	0.807	0.707
	ParkingLot	0.366	0.318	0.323	0.374	0.496	0.531	0.566	0.595	0.646	0.617	0.734
	ParkingLot	0.911	0.658	0.468	0.222	0.362	0.187	0.273	0.252	0.231	0.358	0.388
CIF	*Silence of the Lambs*	0.922	0.914	0.918	0.909	0.906	0.883	0.901	0.791	0.811	0.927	0.844
64 kbps	*Silence of the Lambs*	1.019	1.092	1.082	1.032	1.023	1.043	1.015	1.078	1.038	1.140	1.161
R.C.	*Terminator One*	0.794	0.778	0.770	0.757	0.767	0.828	0.831	0.863	0.900	0.915	0.954
	Terminator One	1.030	1.012	0.968	0.876	0.897	0.708	0.782	0.701	0.596	0.717	0.624
	Snowboard with Comm	0.741	0.697	0.668	0.628	0.609	0.591	0.579	0.582	0.472	0.487	0.400
	Snowboard with Comm	1.103	1.031	0.861	0.899	0.821	0.667	0.691	0.628	0.730	0.600	0.572
	Oprah w/o Comm	0.847	0.819	0.790	0.761	0.758	0.774	0.704	0.686	0.791	0.652	0.690
	Oprah w/o Comm	1.058	1.138	1.175	1.064	1.049	0.942	1.014	1.036	0.866	1.005	0.871
	LectureHQ-Reisslein	0.848	0.840	0.824	0.819	0.819	0.857	0.839	0.859	0.884	0.965	0.974
	LectureHQ-Reisslein	1.072	1.022	0.957	0.979	0.911	0.904	0.923	0.912	0.930	0.878	0.850
	ParkingLot	0.395	0.348	0.358	0.412	0.481	0.496	0.564	0.607	0.674	0.606	0.733
	ParkingLot	0.903	0.682	0.498	0.291	0.395	0.212	0.238	0.273	0.190	0.320	0.347
CIF	*Silence of the Lambs*	0.917	0.902	0.906	0.894	0.877	0.851	0.862	0.758	0.769	0.873	0.807
128 kbps	*Silence of the Lambs*	0.999	1.077	1.071	1.015	1.032	1.090	1.052	1.031	1.052	1.133	1.160
R.C.	*Terminator One*	0.800	0.781	0.773	0.761	0.767	0.830	0.839	0.874	0.903	0.934	0.950
	Terminator One	1.048	1.026	0.975	0.885	0.878	0.739	0.780	0.710	0.599	0.732	0.641
	Snowboard with Comm	0.750	0.707	0.677	0.637	0.616	0.597	0.594	0.604	0.488	0.506	0.417
	Snowboard with Comm	1.129	1.060	0.887	0.923	0.834	0.693	0.737	0.665	0.775	0.639	0.606
	Oprah w/o Comm	0.844	0.812	0.789	0.752	0.751	0.762	0.698	0.672	0.779	0.649	0.685
	Oprah w/o Comm	1.097	1.144	1.168	1.083	1.067	0.963	1.016	1.049	0.861	0.975	0.871
	LectureHQ-Reisslein	0.843	0.838	0.822	0.815	0.807	0.846	0.835	0.853	0.874	0.935	0.963
	LectureHQ-Reisslein	1.046	1.014	0.962	0.970	0.887	0.896	0.900	0.889	0.797	0.841	0.738
	ParkingLot	0.404	0.357	0.370	0.425	0.494	0.509	0.576	0.616	0.694	0.619	0.752
	ParkingLot	0.918	0.691	0.522	0.318	0.413	0.232	0.275	0.290	0.215	0.326	0.374
CIF	*Silence of the Lambs*	0.912	0.902	0.900	0.891	0.874	0.844	0.857	0.755	0.761	0.869	0.814
256 kbps	*Silence of the Lambs*	0.993	1.066	1.076	1.024	1.015	1.110	1.028	0.998	1.066	1.066	1.155
R.C.	*Terminator One*	0.800	0.783	0.774	0.763	0.764	0.838	0.851	0.884	0.903	0.935	0.958
	Terminator One	1.025	1.009	0.979	0.879	0.882	0.761	0.777	0.728	0.600	0.742	0.655
	Snowboard with Comm	0.751	0.709	0.674	0.639	0.619	0.586	0.579	0.578	0.449	0.500	0.418
	Snowboard with Comm	1.143	1.063	0.899	0.924	0.839	0.698	0.729	0.702	0.830	0.658	0.619
	Oprah w/o Comm	0.839	0.801	0.775	0.741	0.740	0.746	0.687	0.658	0.753	0.630	0.666
	Oprah w/o Comm	1.086	1.130	1.169	1.074	1.064	0.947	1.003	1.049	0.841	0.972	0.868
	LectureHQ-Reisslein	0.849	0.844	0.829	0.824	0.819	0.863	0.851	0.868	0.881	0.944	0.981
	LectureHQ-Reisslein	1.034	1.001	0.953	0.966	0.899	0.892	0.935	0.914	0.798	0.850	0.757
	ParkingLot	0.400	0.352	0.362	0.417	0.482	0.496	0.573	0.597	0.666	0.593	0.733
	ParkingLot	0.921	0.705	0.516	0.280	0.403	0.228	0.240	0.273	0.217	0.314	0.328

Table 9 gives the Hurst parameter estimated using the variance time plot as well as the scaling parameters c_f and α (also expressed as $H = (1+\alpha)/2$) estimated from the logscale diagram. With the exception of *ParkingLot* encoding at 060810 quality all H estimates obtained from the variance time plots tend to be nearly equal to the ones obtained for corresponding base layer traffic. The rate controlled sequences have similar H estimate from variance time plots (Figures 18) as they all are encoded with Medium quality and hence we find these values to be equal to Medium quality values (of enhancement layer). There is considerable difference in the H estimate obtained from logscale diagrams. Most of the estimates are greater than one, because of non-Gaussian traffic. It is quite interesting to note that *ParkingLot* exhibits long range dependence for large a.

Comparing the enhancement layer traffic logscale plots (Figure 21) with that of the base layer traffic (Figure 10) we find that *Silence of the Lambs* and *Oprah w/o Comm* show similar behavior whereas *Snowboard with Comm* shows a different behavior (for encodings without rate control). For encodings with rate control we find the logscale plots to be similar to the corresponding medium quality enhancement layer logscale plots.

As the quality of encoding decreases, we find normalized form $\underline{c}_f$ to decrease.

Table 9: Hurst parameters estimated from variance time plot, scaling parameters estimated from logscale diagram for enhancement layer traffic.

		VT	Logscale Diagram		
Enc. M.	Video	H	$\underline{c}_f$	α	H
CIF	*Silence of the Lambs*	0.915	0.000	2.163	1.582
H.Q.	*Terminator One*	0.821	0.035	1.001	1
No.R.C.	*Snowboard with Comm*	0.437	0.221	0.827	0.914
	Oprah w/o Comm	0.868	0.001	1.598	1.299
	LectureHQ-Reisslein	0.816	0.006	1.135	1.067
	ParkingLot	0.563	0.048	0.982	0.991
CIF	*Silence of the Lambs*	0.899	0.000	2.156	1.578
040608.Q.	*Terminator One*	0.796	0.035	0.957	0.979
No.R.C.	*Snowboard with Comm*	0.442	0.159	0.839	0.919
	Oprah w/o Comm	0.808	0.034	0.980	0.990
	LectureHQ-Reisslein	0.779	0.015	0.848	0.924
	ParkingLot	0.510	845797.709	-1.765	-0.383
CIF	*Silence of the Lambs*	0.892	0.000	2.148	1.574
060810.Q.	*Terminator One*	0.785	0.038	0.937	0.968
No.R.C.	*Snowboard with Comm*	0.447	0.157	0.844	0.922
	Oprah w/o Comm	0.768	0.004	1.392	1.196
	LectureHQ-Reisslein	0.864	0.024	0.725	0.863
	ParkingLot	0.922	0.026	0.626	0.813
CIF	*Silence of the Lambs*	0.892	0.000	2.187	1.594
H.M.Q.	*Terminator One*	0.783	0.040	0.937	0.968
No.R.C.	*Snowboard with Comm*	0.437	0.177	0.842	0.921
	Oprah w/o Comm	0.763	0.005	1.402	1.201
	LectureHQ-Reisslein	0.778	0.012	0.985	0.992
	ParkingLot	0.483	772879.017	-1.758	-0.379
CIF	*Silence of the Lambs*	0.875	0.000	2.088	1.544
M.Q.	*Terminator One*	0.76	0.023	1.016	1.008
No.R.C.	*Snowboard with Comm*	0.468	0.154	0.849	0.925
	Oprah w/o Comm	0.713	0.020	1.113	1.056
	LectureHQ-Reisslein	0.726	0.013	0.953	0.976

Table 9: *continued*

Enc. M.	Video	VT H	Logscale Diagram $\underline{c}_f$	α	H
	ParkingLot	0.438	76946.563	-1.535	-0.267
CIF	*Silence of the Lambs*	0.864	0.000	2.066	1.533
M.L.Q.	*Terminator One*	0.745	0.029	0.974	0.987
No.R.C.	*Snowboard with Comm*	0.454	0.158	0.842	0.921
	Oprah w/o Comm	0.667	0.020	1.068	1.034
	LectureHQ-Reisslein	0.712	0.279	0.397	0.699
	ParkingLot	0.403	946.981	-0.967	0.016
CIF	*Silence of the Lambs*	0.856	0.013	1.137	1.068
L.Q.	*Terminator One*	0.739	0.027	0.99	0.995
No.R.C.	*Snowboard with Comm*	0.46	0.162	0.833	0.917
	Oprah w/o Comm	0.636	0.021	1.047	1.024
	LectureHQ-Reisslein	0.665	0.212	0.434	0.717
	ParkingLot	0.372	3360.478	-1.167	-0.084
CIF	*Silence of the Lambs*	0.879	0.000	2.011	1.505
64 kbps	*Terminator One*	0.756	0.053	0.893	0.947
R.C.	*Snowboard with Comm*	0.42	0.126	0.848	0.924
	Oprah w/o Comm	0.723	0.012	1.117	1.059
	LectureHQ-Reisslein	0.808	1.315	0.126	0.563
	ParkingLot	0.435	160305.006	-1.659	-0.329
CIF	*Silence of the Lambs*	0.876	0.000	2.104	1.552
128 kbps	*Terminator One*	0.759	0.055	0.9	0.95
R.C.	*Snowboard with Comm*	0.445	0.121	0.868	0.934
	Oprah w/o Comm	0.711	0.016	1.138	1.069
	LectureHQ-Reisslein	0.747	0.011	0.987	0.994
	ParkingLot	0.455	84688.982	-1.56	-0.28
CIF	*Silence of the Lambs*	0.867	0.000	2.156	1.578
256 kbps	*Terminator One*	0.763	0.052	0.883	0.942
R.C.	*Snowboard with Comm*	0.455	0.153	0.848	0.924
	Oprah w/o Comm	0.696	0.023	1.101	1.051
	LectureHQ-Reisslein	0.743	0.012	0.979	0.99
	ParkingLot	0.44	132347.288	-1.593	-0.296

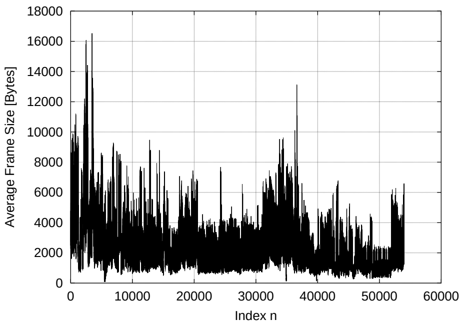
Table 10 gives the scaling parameters α_q for the orders $q = 0.5,\ 1,\ 1.5,\ 2,\ 2.5,\ 3,\ 3.5,$ and 4. As was observed before, the scaling parameters increase with increasing q. The Hurst parameter estimates obtained from the multiscale diagram (Figures 22) for the enhancement layer are in many cases quite different, but we find some encodings which still behave alike in enhancement layer but there is no consistent trend in the behavior. *ParkingLot* encoded with High quality gives $H = 0.9$ indicating long range dependence, whereas for all other quality levels it does not show long range behavior. Multiscale parameters are alike for 64, 128, and 256 kbps target bit rate encodings. Figure 23 gives linear multiscale diagrams.

Table 10: Scaling parameters estimated from multiscale diagram for enhancement layer traffic.

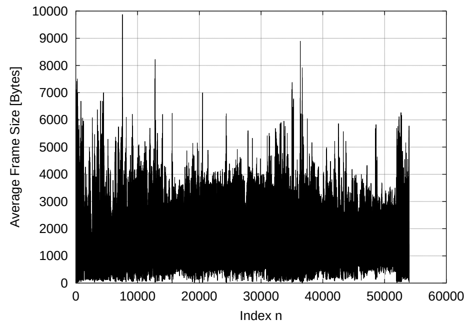
		Multiscale Diagram, α_q for							
Enc. M.	Video	$q = 0.5$	$q = 1$	$q = 1.5$	$q = 2$	$q = 2.5$	$q = 3$	$q = 3.5$	$q = 4$
CIF	*Silence of the Lambs*	0.992	1.847	2.625	3.359	4.065	4.752	5.424	6.086
H.Q.	*Terminator One*	0.513	1.003	1.480	1.947	2.406	2.860	3.306	3.744
No.R.C.	*Snowboard with Comm*	0.494	0.960	1.409	1.845	2.275	2.699	3.121	3.540
	Oprah w/o Comm	0.680	1.336	1.965	2.579	3.184	3.783	4.386	4.963
	LectureHQ-Reisslein	0.534	1.075	1.627	2.185	2.740	3.289	3.833	4.371
	ParkingLot	0.626	1.258	1.889	2.503	3.104	3.666	4.201	4.670
CIF	*Silence of the Lambs*	0.965	1.851	2.673	3.448	4.192	4.914	5.621	6.317
040608.Q.	*Terminator One*	0.475	0.949	1.422	1.893	2.355	2.813	3.266	3.716
No.R.C.	*Snowboard with Comm*	0.489	0.958	1.414	1.863	2.311	2.760	3.210	3.660
	Oprah w/o Comm	0.533	1.042	1.542	2.033	2.508	2.962	3.396	3.811
	LectureHQ-Reisslein	0.474	0.927	1.368	1.803	2.234	2.654	3.058	3.430
	ParkingLot	-0.353	-0.667	-0.938	-1.184	-1.419	-1.654	-1.892	-2.133
CIF	*Silence of the Lambs*	0.945	1.838	2.681	3.481	4.248	4.994	5.726	6.448
060810.Q.	*Terminator One*	0.468	0.935	1.404	1.871	2.330	2.784	3.233	3.678
No.R.C.	*Snowboard with Comm*	0.483	0.954	1.412	1.865	2.318	2.774	3.231	3.688
	Oprah w/o Comm	0.632	1.241	1.828	2.408	2.989	3.574	4.160	4.744
	LectureHQ-Reisslein	0.554	1.031	1.424	1.720	1.934	2.091	2.216	2.325
	ParkingLot	0.323	0.799	1.317	1.835	2.342	2.834	3.304	3.751
CIF	*Silence of the Lambs*	0.947	1.853	2.713	3.530	4.314	5.077	5.825	6.563
H.M.Q.	*Terminator One*	0.468	0.937	1.406	1.873	2.330	2.783	3.230	3.673
No.R.C.	*Snowboard with Comm*	0.482	0.951	1.408	1.860	2.313	2.768	3.225	3.684
	Oprah w/o Comm	0.641	1.251	1.836	2.412	2.991	3.574	4.157	4.741
	LectureHQ-Reisslein	0.497	1.003	1.507	2.000	2.483	2.962	3.443	3.917
	ParkingLot	-0.394	-0.709	-0.970	-1.210	-1.448	-1.690	-1.937	-2.191
CIF	*Silence of the Lambs*	0.909	1.815	2.683	3.514	4.318	5.104	5.877	6.642
M.Q.	*Terminator One*	0.507	0.998	1.484	1.956	2.433	2.906	3.375	3.841
No.R.C.	*Snowboard with Comm*	0.480	0.949	1.409	1.867	2.327	2.791	3.257	3.724
	Oprah w/o Comm	0.563	1.107	1.649	2.183	2.699	3.200	3.691	4.174
	LectureHQ-Reisslein	0.492	0.989	1.475	1.942	2.397	2.848	3.300	3.745
	ParkingLot	-0.317	-0.574	-0.799	-1.021	-1.252	-1.497	-1.755	-2.024
CIF	*Silence of the Lambs*	0.903	1.812	2.698	3.556	4.393	5.215	6.027	6.831
M.L.Q.	*Terminator One*	0.496	0.974	1.442	1.897	2.352	2.801	3.232	3.666
No.R.C.	*Snowboard with Comm*	0.477	0.945	1.402	1.858	2.317	2.779	3.241	3.699
	Oprah w/o Comm	0.554	1.103	1.646	2.170	2.671	3.152	3.618	4.073
	LectureHQ-Reisslein	0.428	0.808	1.101	1.280	1.350	1.342	1.291	1.221
	ParkingLot	-0.019	-0.046	-0.091	-0.157	-0.245	-0.350	-0.472	-0.606
CIF	*Silence of the Lambs*	0.532	1.067	1.591	2.089	2.556	2.989	3.394	3.779
L.Q.	*Terminator One*	0.510	0.998	1.468	1.920	2.360	2.788	3.207	3.618
No.R.C.	*Snowboard with Comm*	0.476	0.942	1.399	1.853	2.309	2.765	3.219	3.667
	Oprah w/o Comm	0.531	1.078	1.622	2.142	2.633	3.101	3.550	3.986
	LectureHQ-Reisslein	0.432	0.827	1.132	1.320	1.398	1.398	1.355	1.294
	ParkingLot	-0.053	-0.136	-0.222	-0.315	-0.419	-0.534	-0.661	-0.799
CIF	*Silence of the Lambs*	0.893	1.762	2.582	3.363	4.119	4.860	5.594	6.322
64 kbps	*Terminator One*	0.463	0.919	1.374	1.826	2.269	2.703	3.129	3.548

Table 10: *continued*

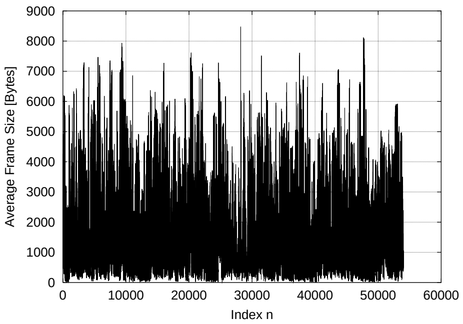
Enc. M.	Video	Multiscale Diagram, α_q for $q=0.5$	$q=1$	$q=1.5$	$q=2$	$q=2.5$	$q=3$	$q=3.5$	$q=4$
R.C.	*Snowboard with Comm*	0.482	0.946	1.402	1.857	2.315	2.779	3.245	3.714
	Oprah w/o Comm	0.563	1.104	1.637	2.173	2.699	3.214	3.719	4.219
	LectureHQ-Reisslein	0.354	0.617	0.793	0.894	0.940	0.951	0.943	0.925
	ParkingLot	-0.373	-0.666	-0.922	-1.164	-1.406	-1.654	-1.908	-2.170
CIF	*Silence of the Lambs*	0.904	1.825	2.708	3.548	4.354	5.136	5.900	6.652
128 kbps	*Terminator One*	0.463	0.921	1.379	1.833	2.278	2.717	3.148	3.572
R.C.	*Snowboard with Comm*	0.487	0.957	1.418	1.876	2.338	2.803	3.272	3.742
	Oprah w/o Comm	0.562	1.110	1.653	2.196	2.725	3.242	3.748	4.247
	LectureHQ-Reisslein	0.503	1.005	1.493	1.967	2.431	2.893	3.352	3.802
	ParkingLot	-0.315	-0.597	-0.850	-1.088	-1.325	-1.565	-1.812	-2.064
CIF	*Silence of the Lambs*	0.923	1.857	2.765	3.636	4.478	5.299	6.103	6.897
256 kbps	*Terminator One*	0.461	0.919	1.374	1.820	2.258	2.687	3.107	3.521
R.C.	*Snowboard with Comm*	0.482	0.950	1.408	1.864	2.322	2.786	3.252	3.719
	Oprah w/o Comm	0.565	1.107	1.637	2.162	2.671	3.164	3.646	4.122
	LectureHQ-Reisslein	0.503	1.003	1.488	1.955	2.412	2.865	3.318	3.762
	ParkingLot	-0.322	-0.601	-0.852	-1.090	-1.326	-1.567	-1.815	-2.070



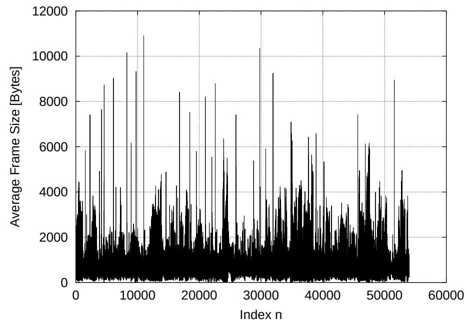
a) *Silence of the Lambs* with high quality



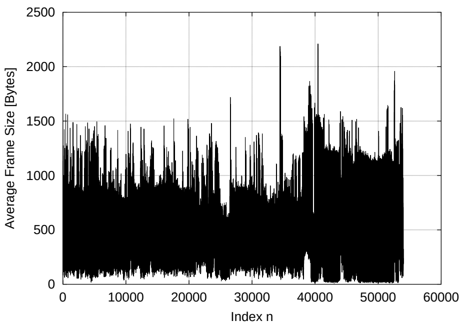
d) *Silence of the Lambs* with 256 kbps target bit rate



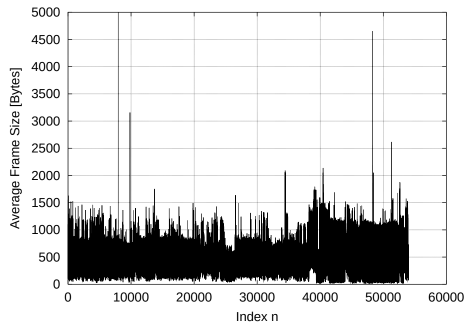
b) *Snowboard with Comm* with medium quality



e) *Snowboard with Comm* with 128 kbps target bit rate



c) *Oprah w/o Comm* with low quality

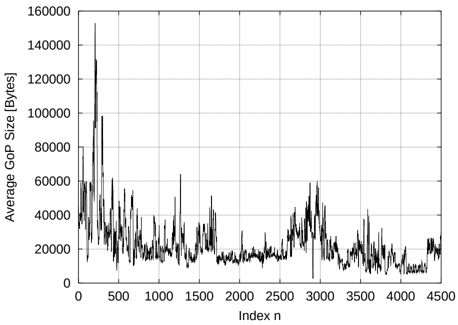


f) *Oprah w/o Comm* with 64 kbps target bit rate

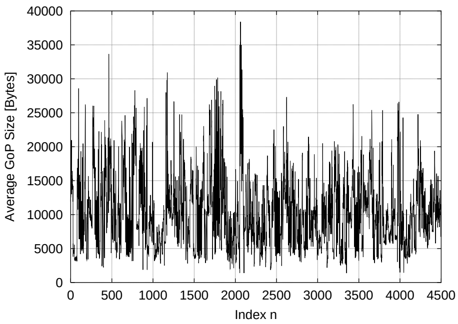
Encoding without rate control

Encoding with rate control

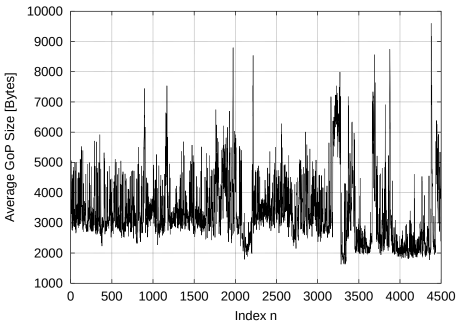
Figure 1: Base layer frame size X_n^b as a function of the frame index n for spatial scalable CIF video.



a) *Silence of the Lambs* with high quality

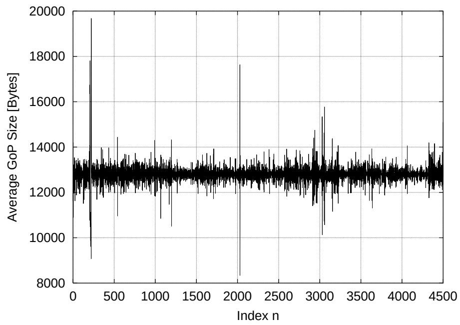


b) *Snowboard with Comm* with medium quality

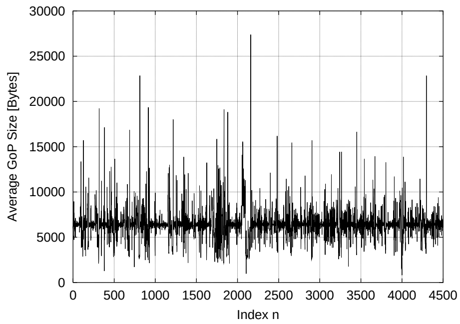


c) *Oprah w/o Comm* with low quality

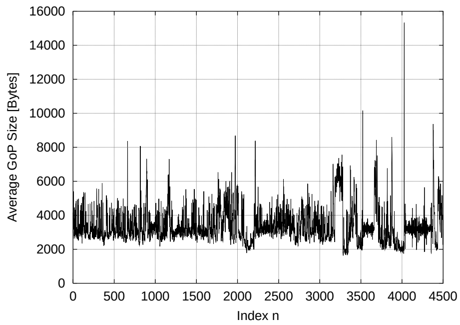
Encoding without rate control



d) *Silence of the Lambs* with 256 kbps target bit rate



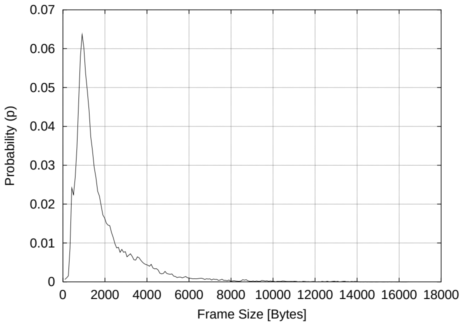
e) *Snowboard with Comm* with 128 kbps target bit rate



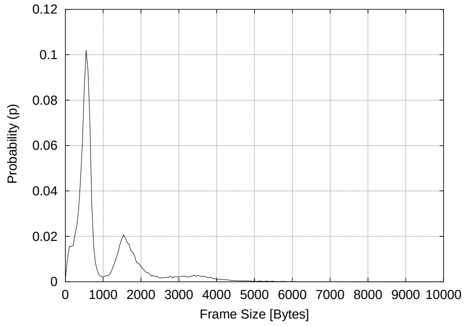
f) *Oprah w/o Comm* with 64 kbps target bit rate

Encoding with rate control

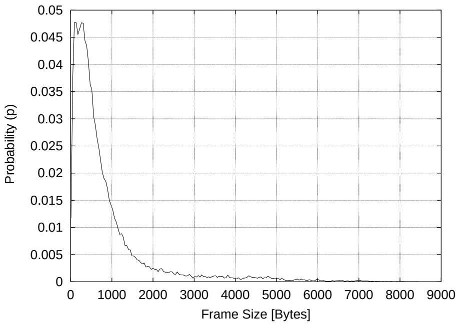
Figure 2: GoP size Y_m^b as a function of the index m for the base layer of spatial scalable CIF video.



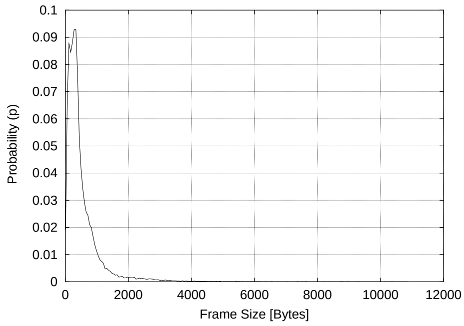
a) *Silence of the Lambs* with high quality



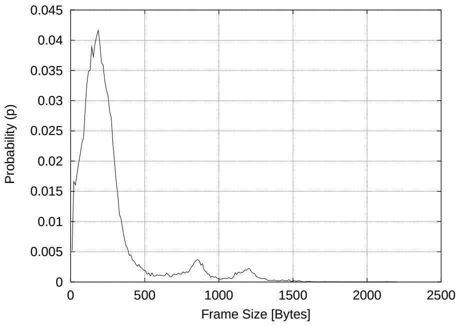
d) *Silence of the Lambs* with 256 kbps target bit rate



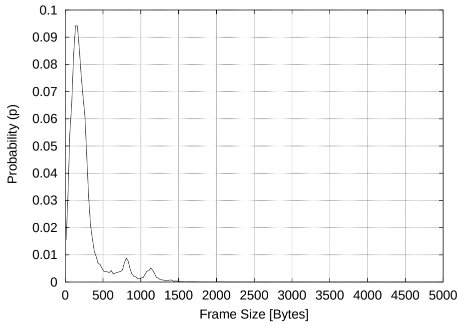
b) *Snowboard with Comm* with medium quality



e) *Snowboard with Comm* with 128 kbps target bit rate



c) *Oprah w/o Comm* with low quality

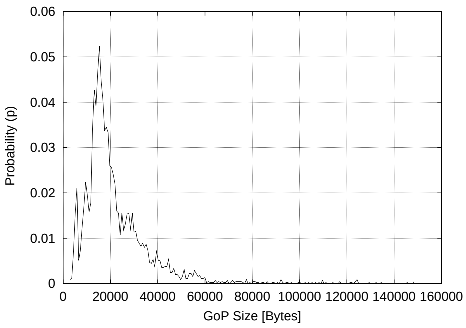


f) *Oprah w/o Comm* with 64 kbps target bit rate

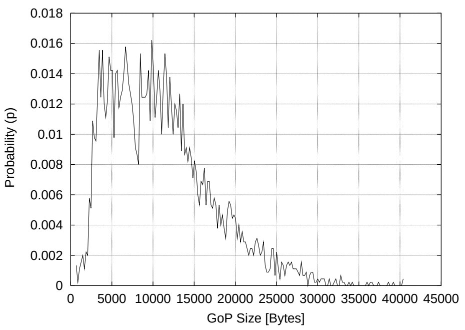
Encoding without rate control

Encoding with rate control

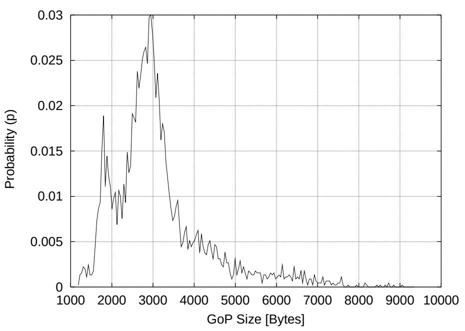
Figure 3: Frame size histograms for the base layer of spatial scalable CIF video.



a) *Silence of the Lambs* with high quality

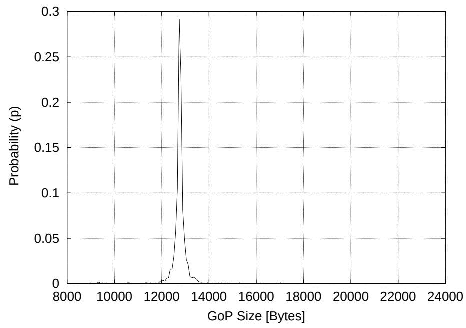


b) *Snowboard with Comm* with medium quality

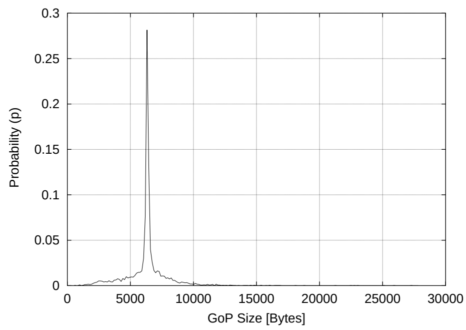


c) *Oprah w/o Comm* with low quality

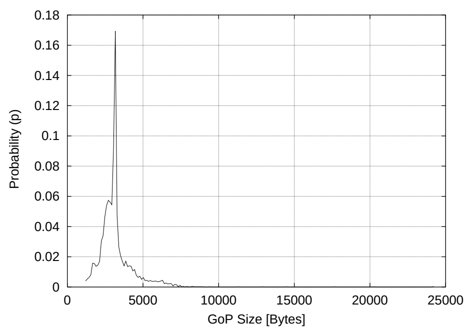
Encoding without rate control



d) *Silence of the Lambs* with 256 kbps target bit rate



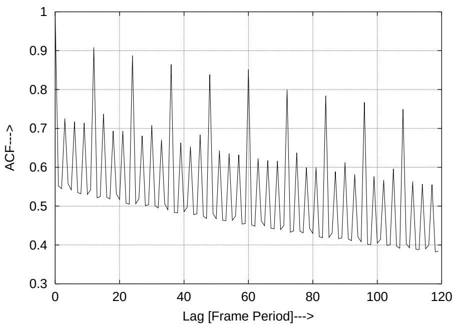
e) *Snowboard with Comm* with 128 kbps target bit rate



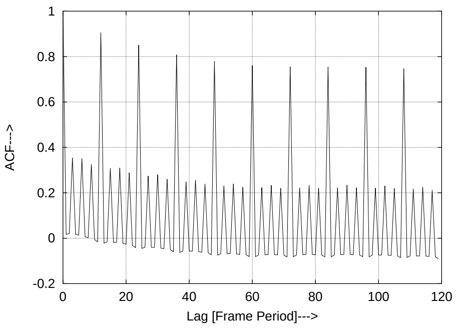
f) *Oprah w/o Comm* with 64 kbps target bit rate

Encoding with rate control

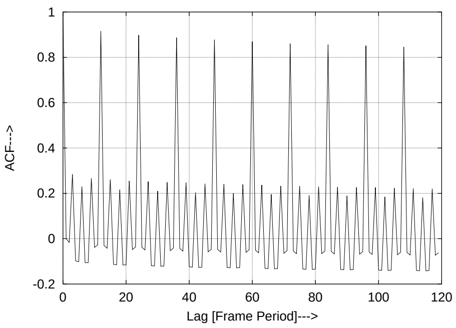
Figure 4: GoP size histograms for the base layer of spatial scalable CIF video.



a) *Silence of the Lambs* with high quality

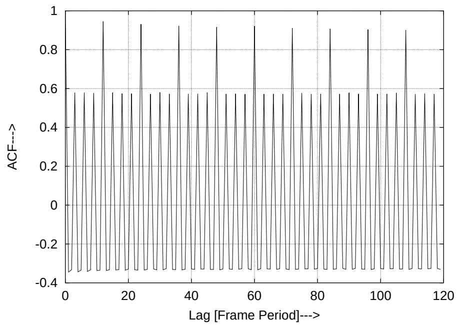


b) *Snowboard with Comm* with medium quality

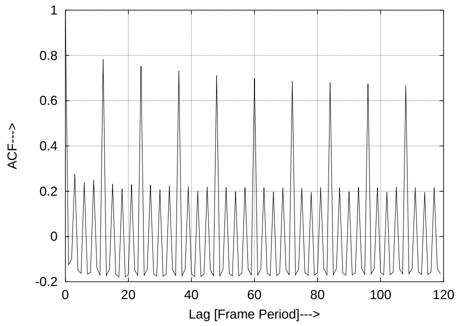


c) *Oprah w/o Comm* with low quality

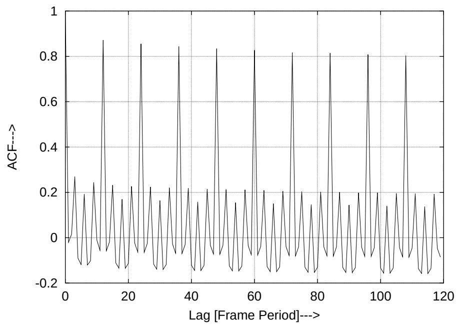
Encoding without rate control



d) *Silence of the Lambs* with 256 kbps target bit rate



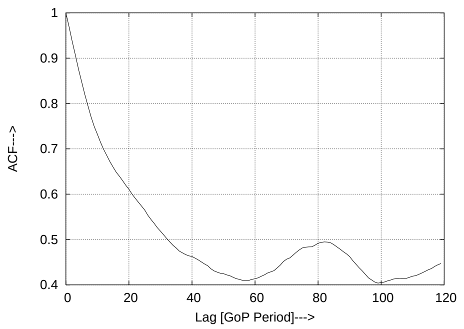
e) *Snowboard with Comm* with 128 kbps target bit rate



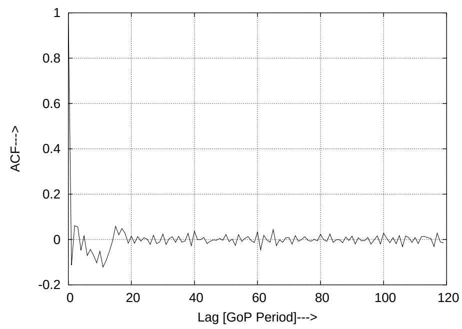
f) *Silence of the Lambs* with 64 kbps target bit rate

Encoding with rate control

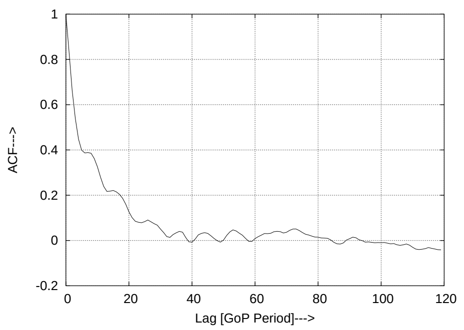
Figure 5: Frame size autocorrelations for the base layer of spatial scalable CIF video.



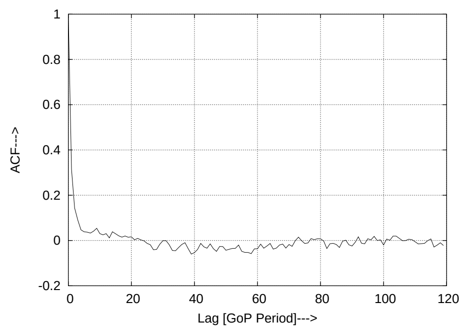
a) *Silence of the Lambs* with high quality



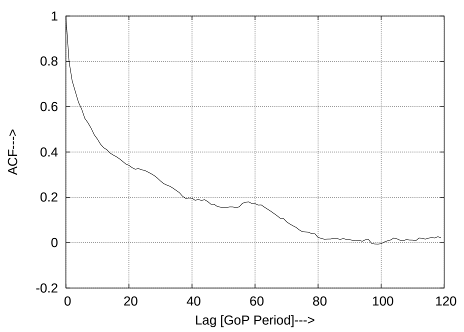
d) *Silence of the Lambs* with 256 kbps target bit rate



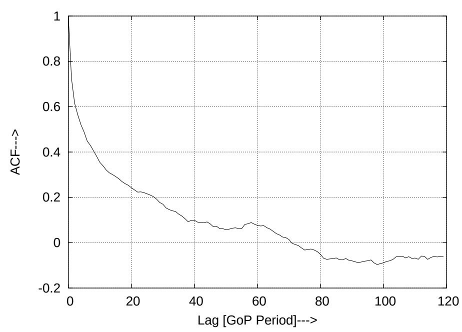
b) *Snowboard with Comm* with medium quality



e) *Snowboard with Comm* with 128 kbps target bit rate



c) *Oprah w/o Comm* with low quality

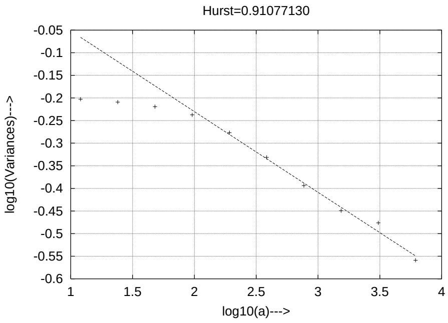


f) *Oprah w/o Comm* with 64 kbps target bit rate

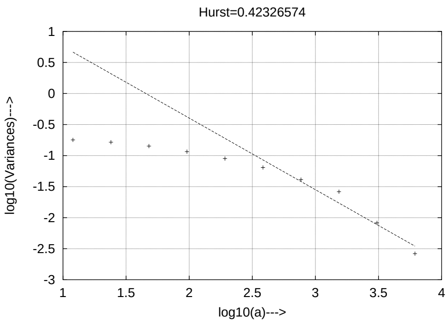
Encoding without rate control

Encoding with rate control

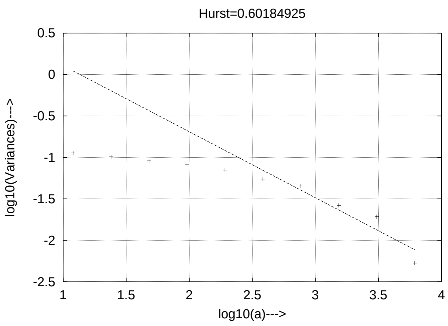
Figure 6: GoP size correlations for the base layer of spatial scalable CIF video.



a) *Silence of the Lambs* with high quality

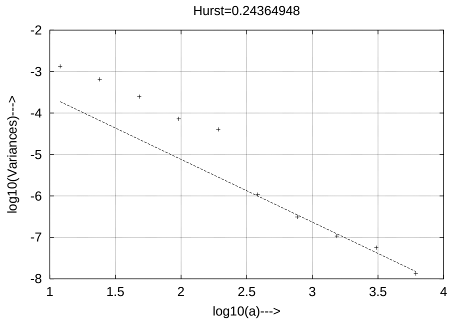


b) *Snowboard with Comm* with medium quality

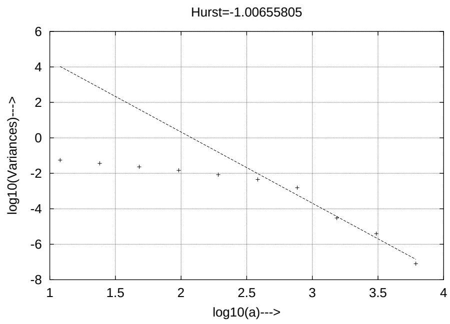


c) *Oprah w/o Comm* with low quality

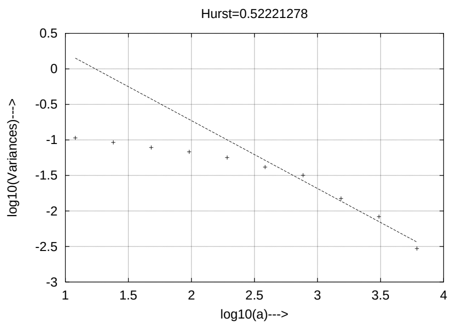
Encoding without rate control



d) *Silence of the Lambs* with 256 kbps target bit rate



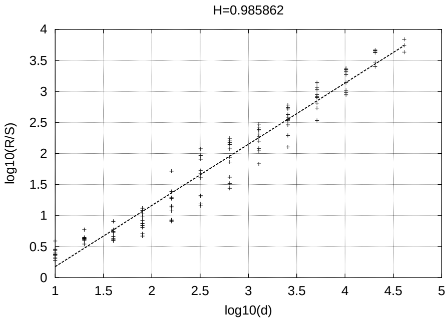
e) *Snowboard with Comm* with 128 kbps target bit rate



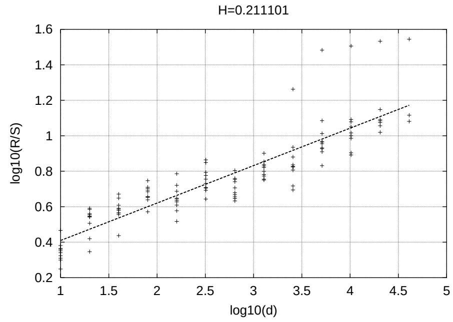
f) *Oprah w/o Comm* with 64 kbps target bit rate

Encoding with rate control

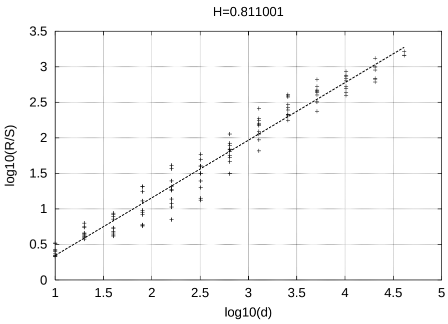
Figure 7: Variance time plots for base layer of spatial scalable CIF video.



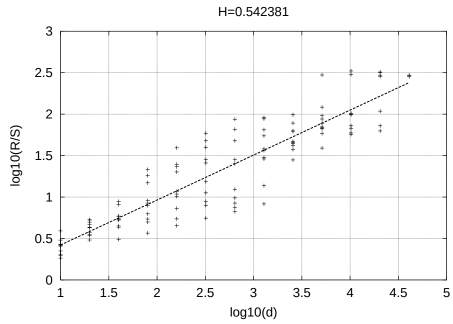
a) *Silence of the Lambs* with high quality



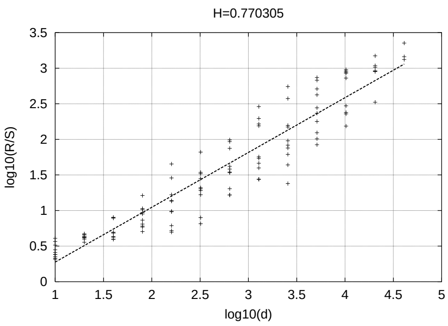
d) *Silence of the Lambs* with 256 kbps target bit rate



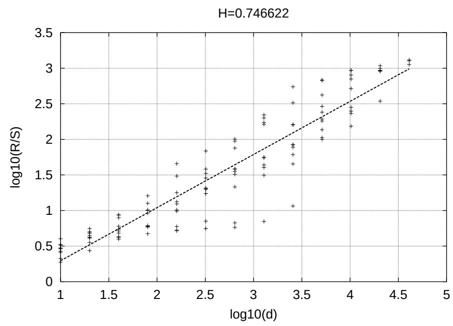
b) *Snowboard with Comm* with medium quality



e) *Snowboard with Comm* with 128 kbps target bit rate



c) *Oprah w/o Comm* with low quality

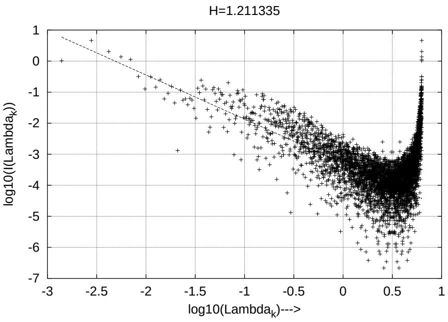


f) *Oprah w/o Comm* with 64 kbps target bit rate

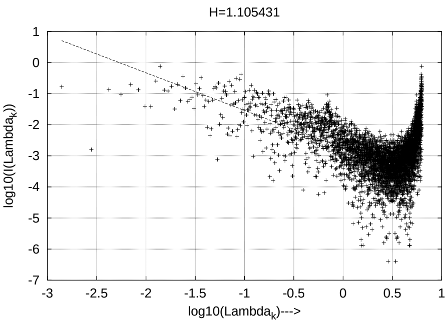
Encoding without rate control

Encoding with rate control

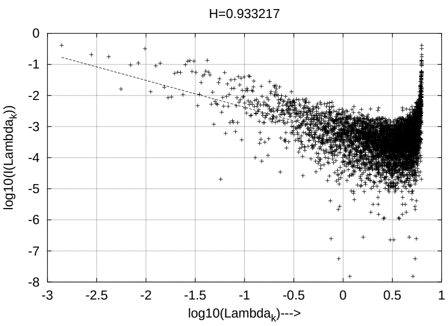
Figure 8: Pox plots of R/S for aggregation level $a = 12$ for base layer of spatial scalable CIF video.



a) *Silence of the Lambs* with high quality

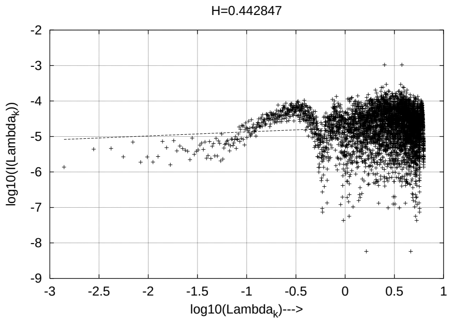


b) *Snowboard with Comm* with medium quality

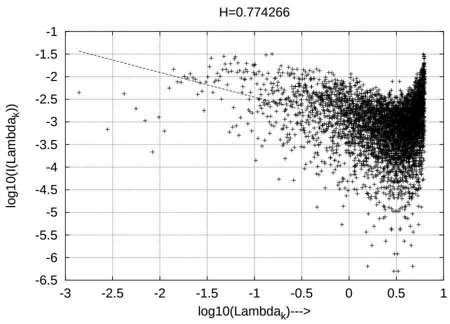


c) *Oprah w/o Comm* with low quality

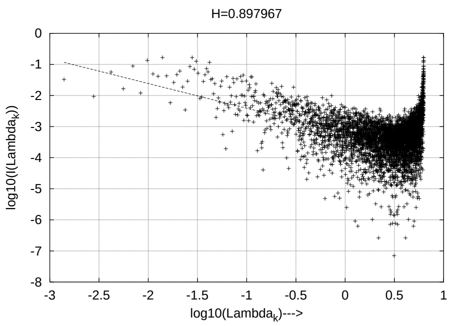
Encoding without rate control



d) *Silence of the Lambs* with 256 kbps target bit rate



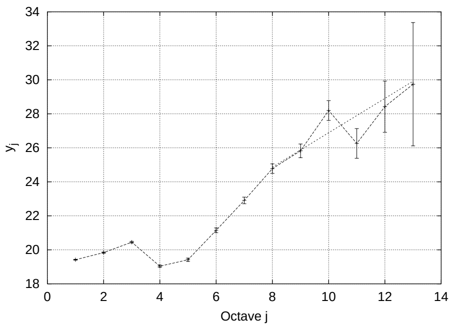
e) *Snowboard with Comm* with 128 kbps target bit rate



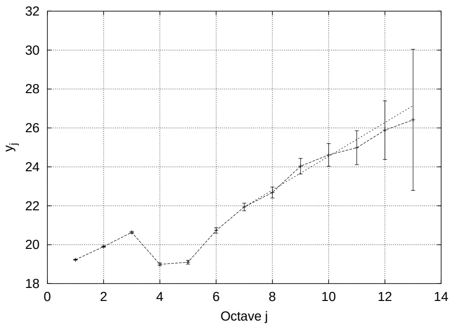
f) *Oprah w/o Comm* with 64 kbps target bit rate

Encoding with rate control

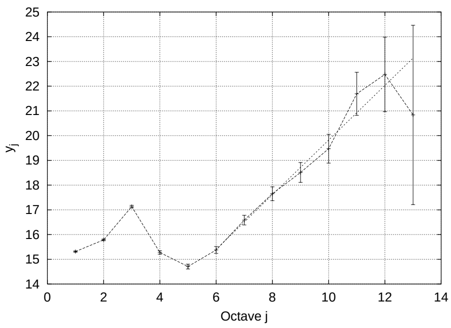
Figure 9: Periodogram for aggregation level $a = 12$ for base layer of spatial scalable CIF video.



a) *Silence of the Lambs* with high quality

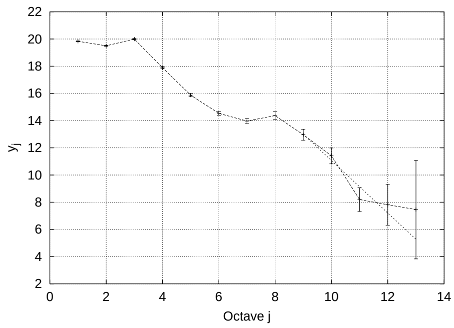


b) *Snowboard with Comm* with medium quality

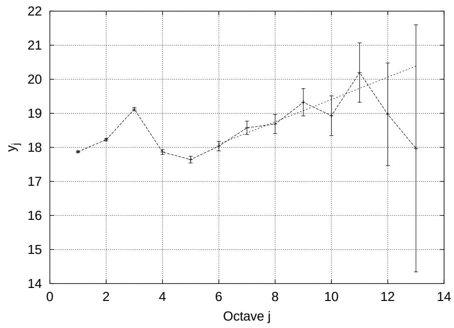


c) *Oprah w/o Comm* with low quality

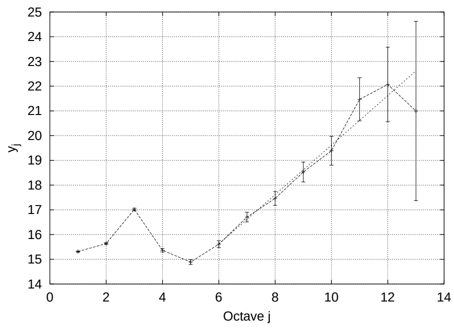
Encoding without rate control



d) *Silence of the Lambs* with 256 kbps target bit rate



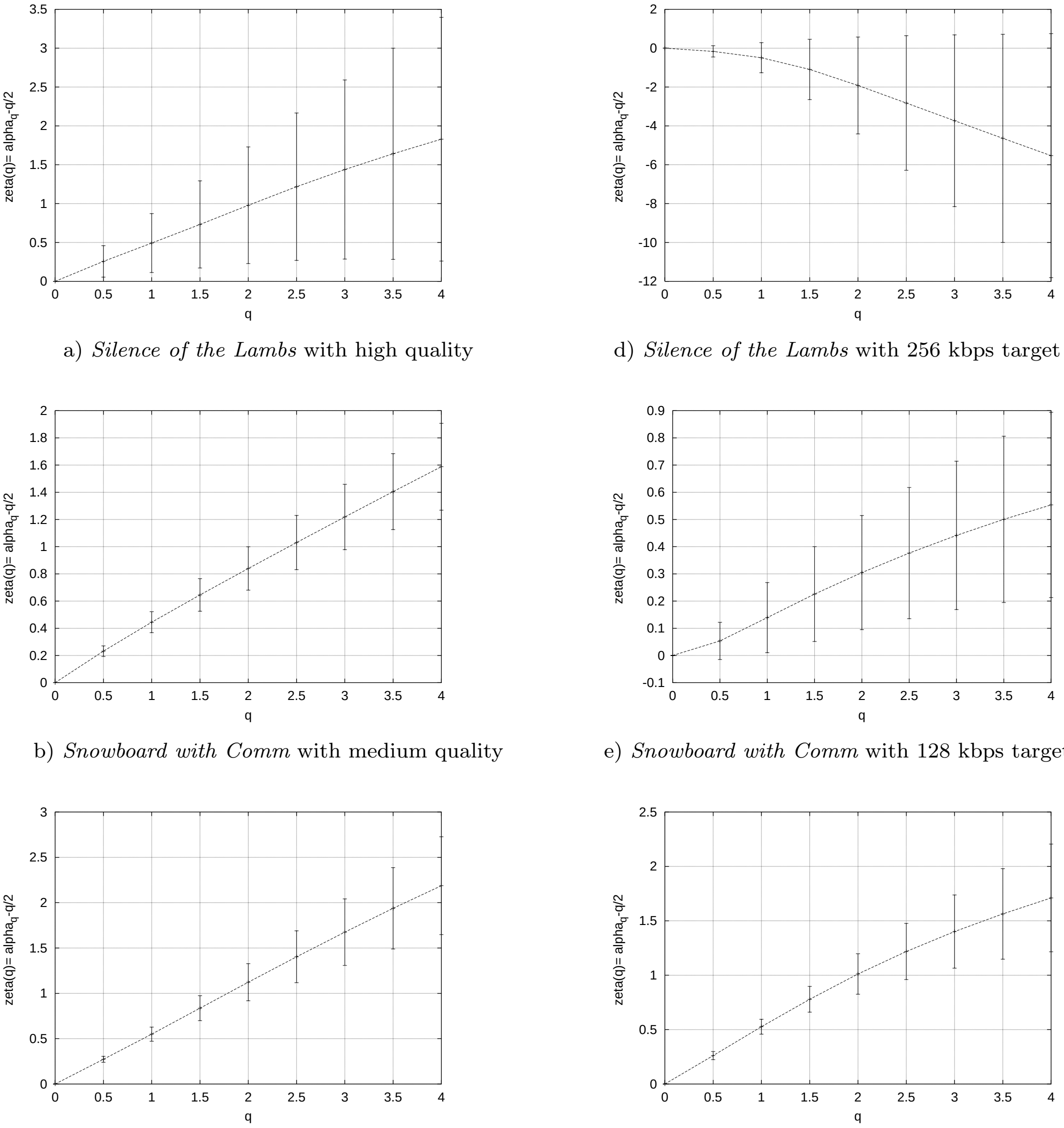
e) *Snowboard with Comm* with 128 kbps target bit rate



f) *Oprah w/o Comm* with 64 kbps target bit rate

Encoding with rate control

Figure 10: Logscale diagrams for base layer of spatial scalable CIF video.



a) *Silence of the Lambs* with high quality

b) *Snowboard with Comm* with medium quality

c) *Oprah w/o Comm* with low quality

Encoding without rate control

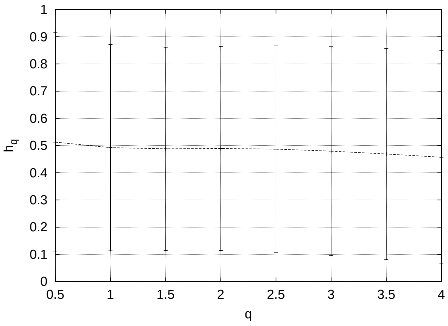
d) *Silence of the Lambs* with 256 kbps target bit rate

e) *Snowboard with Comm* with 128 kbps target bit rate

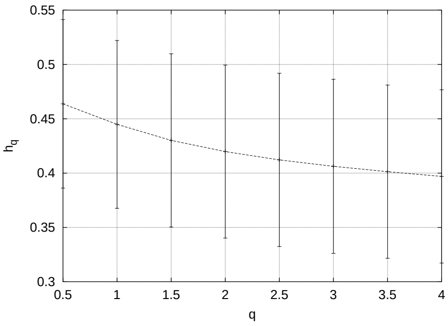
f) *Oprah w/o Comm* with 64 kbps target bit rate

Encoding with rate control

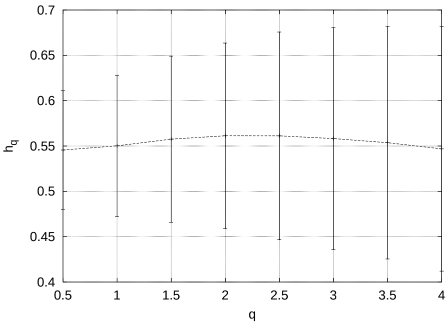
Figure 11: Multiscale diagrams for base layer of spatial scalable CIF video.



a) *Silence of the Lambs* with high quality

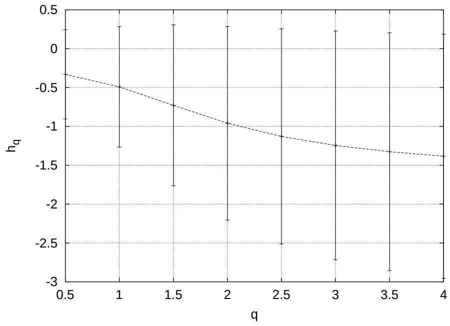


b) *Snowboard with Comm* with medium quality

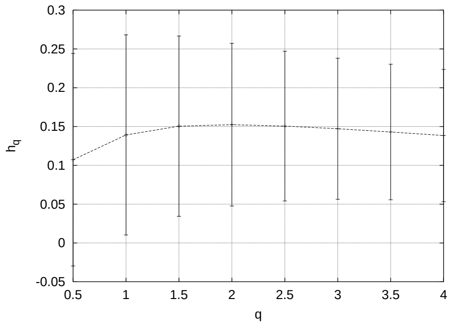


c) *Oprah w/o Comm* with low quality

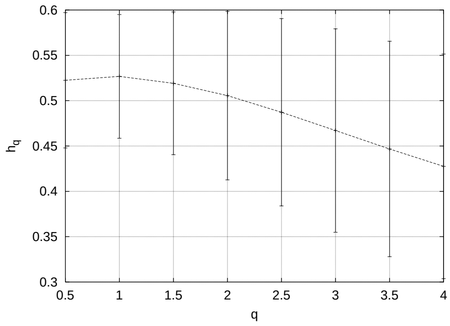
Encoding without rate control



d) *Silence of the Lambs* with 256 kbps target bit rate



e) *Snowboard with Comm* with 128 kbps target bit rate



f) *Oprah w/o Comm* with 64 kbps target bit rate

Encoding with rate control

Figure 12: Linear multiscale diagrams for base layer of spatial scalable CIF video.